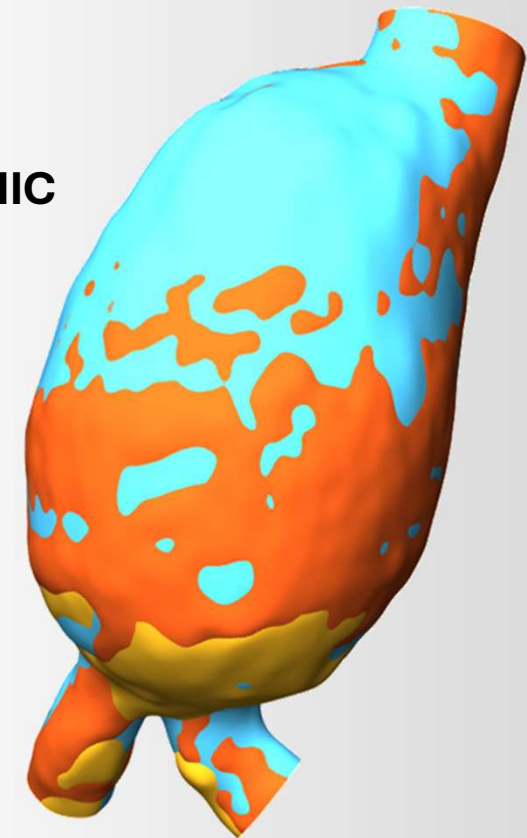


IMPACT OF IMAGE SEGMENTATION VARIABILITY ON HEMODYNAMIC PREDICTIONS OF FLOW QUANTITIES IN AAA

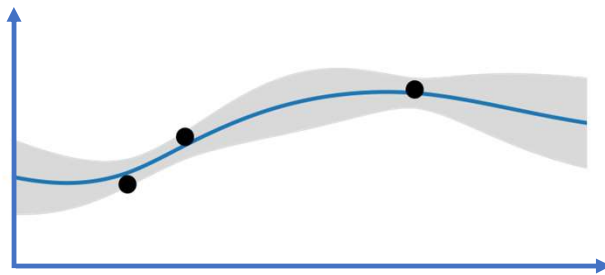
Antonio Martínez^{1,4}, Daan Jongerius², Marc Horner³, Leonardo Geronzi¹,
Eirini Kardampiki¹, Marco Evangelos Biancolini¹

1. University of Rome "Tor Vergata", Italy;
2. Eindhoven University of Technology, Netherlands;
3. Ansys, Inc, Evanston, IL, USA; 4. Ansys, Inc, Lyon, France



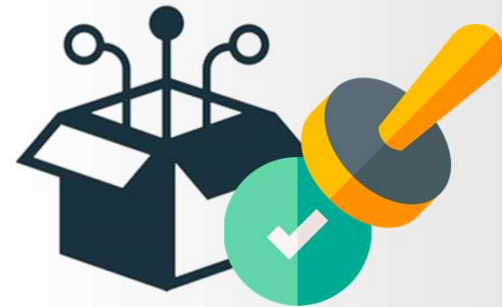
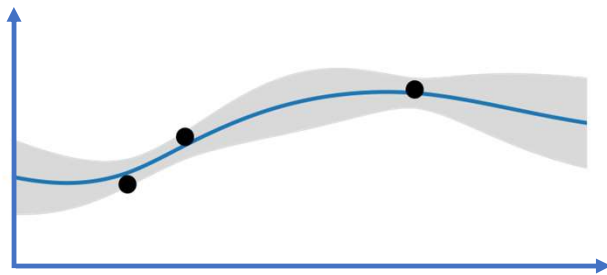
/ Background

- ▶ In order to incorporate computational models into the clinical industry, a thorough understanding on the uncertainty introduced by the model inputs is mandatory.



/ Background

- ▶ In order to incorporate computational models into the clinical industry, a thorough understanding on the uncertainty introduced by the model inputs is mandatory.
- ▶ Introducing an in-silico product on the market requires FDA or EU MDR approval, which is obtained after a verification and validation procedure. This process requires establishing tolerances and deviations margins on the software's output.



/ Uncertainty sources



/ Uncertainty sources



▶ Data acquisition

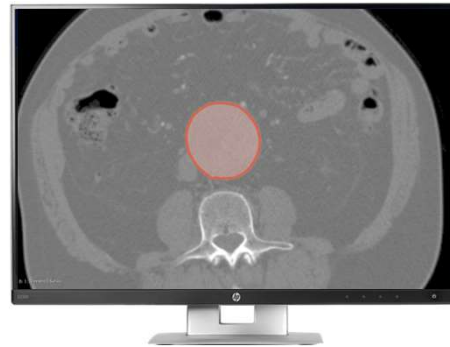
Spatial resolution
Temporal resolution
Artifacts
Noise

/ Uncertainty sources



▶ Data acquisition

Spatial resolution
Temporal resolution
Artifacts
Noise



▶ Data preprocessing

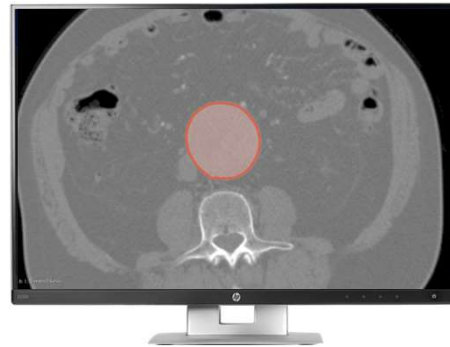
Segmentation
Smoothing
Filtering

/ Uncertainty sources



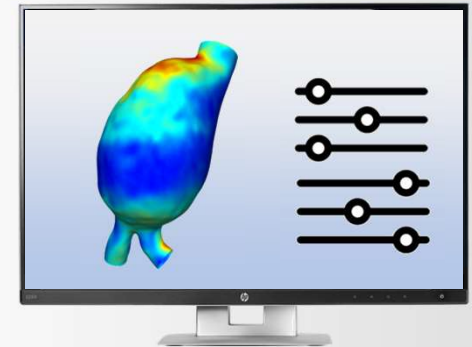
▶ Data acquisition

Spatial resolution
Temporal resolution
Artifacts
Noise



▶ Data preprocessing

Segmentation
Smoothing
Filtering



▶ Model setup

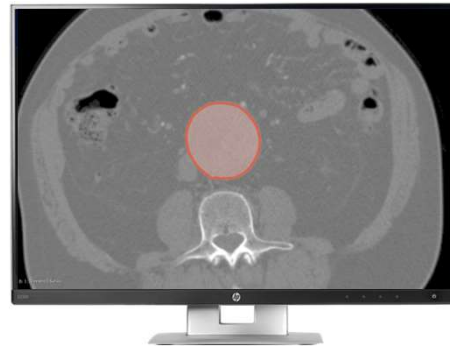
Turbulence model
Material models
Boundary conditions
CFD-FEM-FSI

/ Uncertainty sources



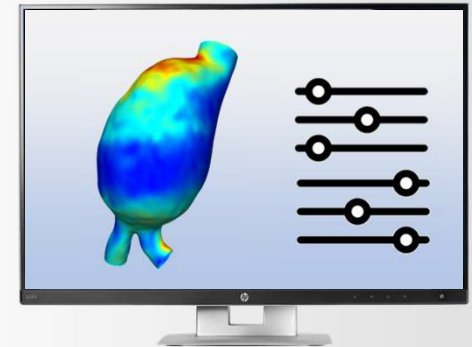
▶ Data acquisition

Spatial resolution
Temporal resolution
Artifacts
Noise



▶ Data preprocessing

Segmentation
Smoothing
Filtering



▶ Model setup

Turbulence model
Material models
Boundary conditions
CFD-FEM-FSI

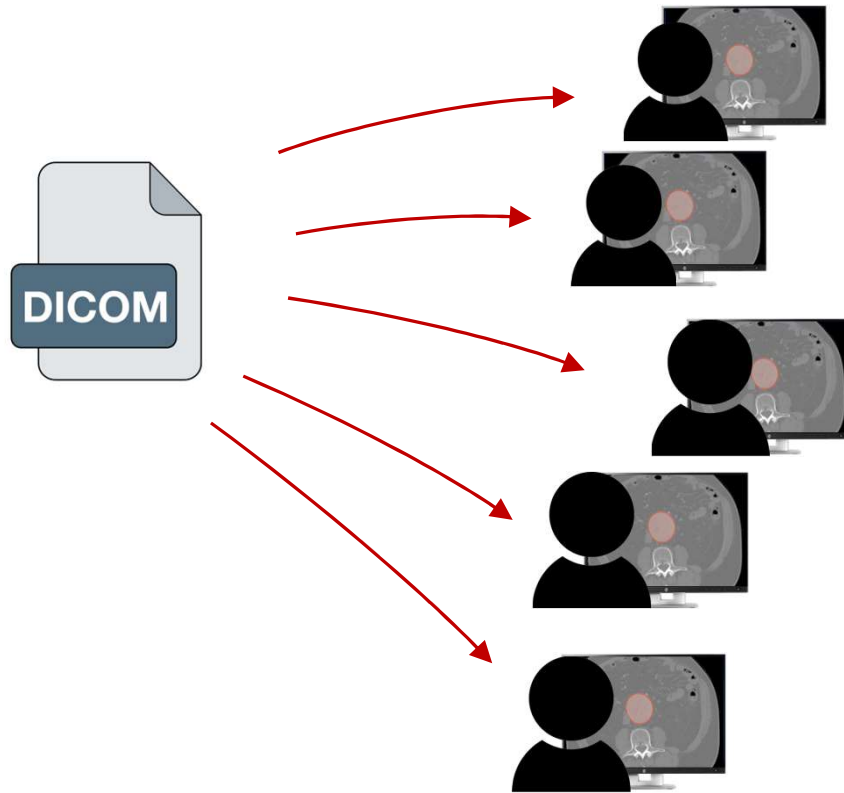
Workflow



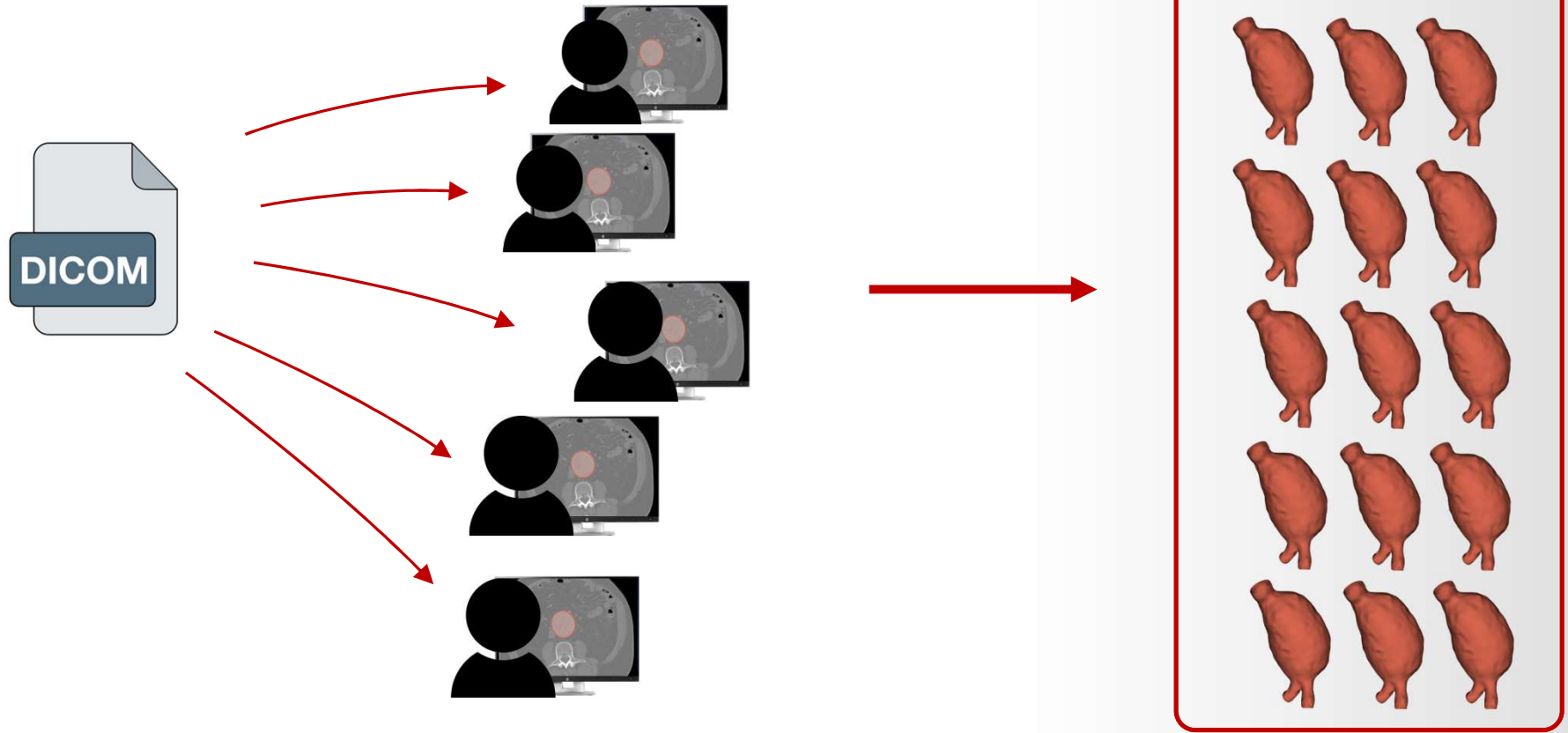
Workflow

- ▶ CT Scan segmented by 15 independent groups.
- ▶ Quantification of the geometric variability.
- ▶ Run steady and transient CFD analyses.
- ▶ Quantification of the variability on hemodynamic variables.

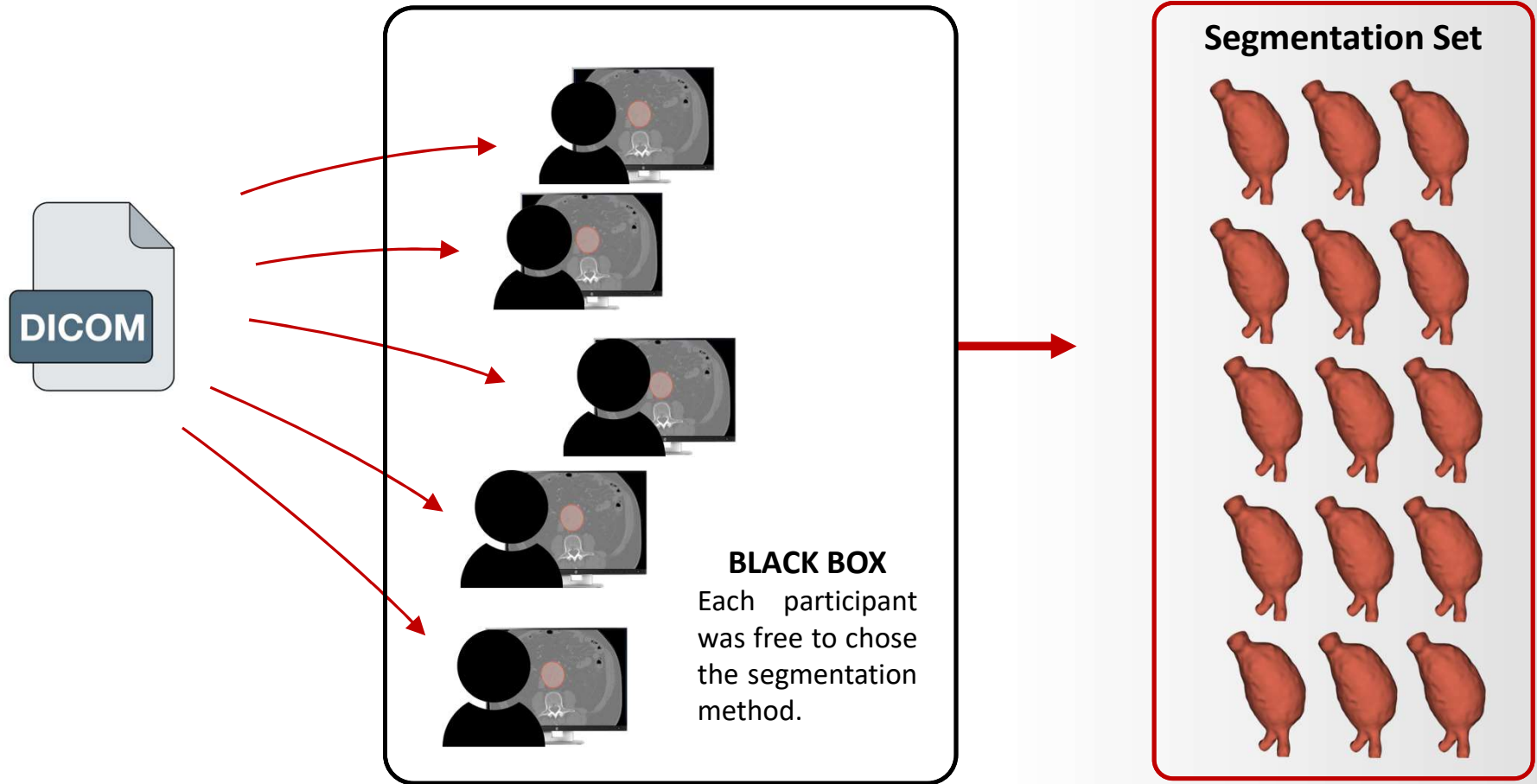
Segmentation



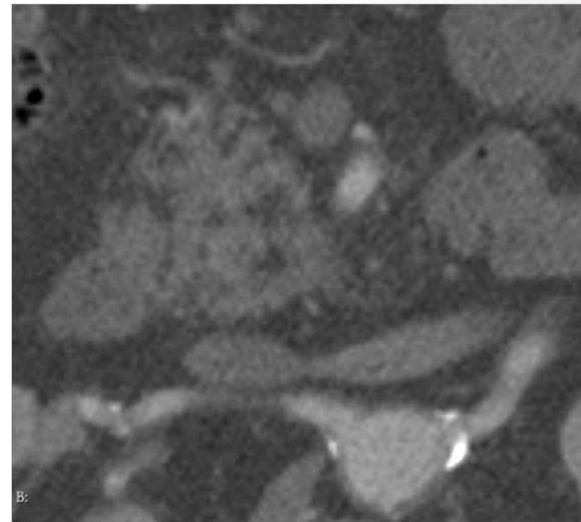
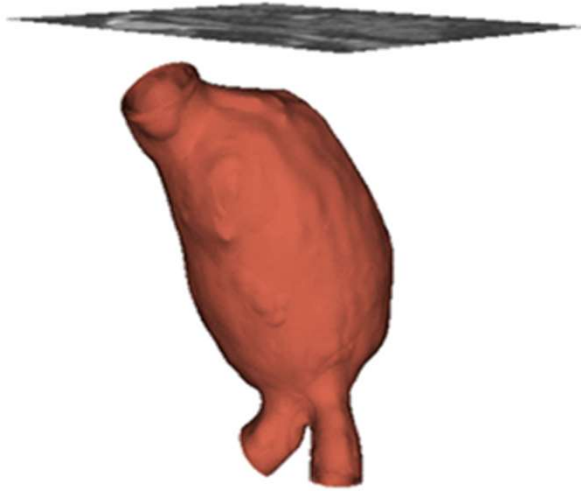
Segmentation



Segmentation

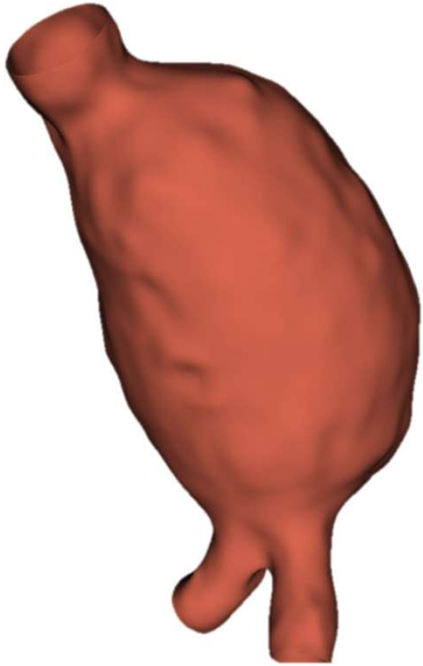


/ Segmentation

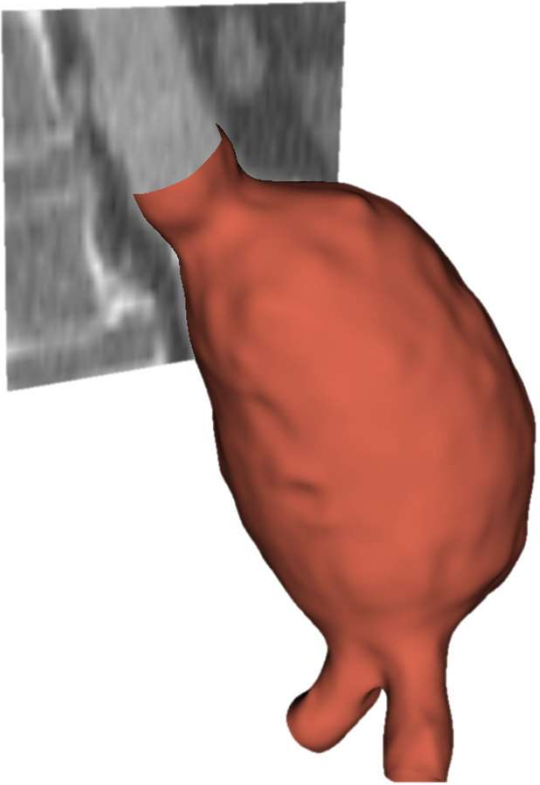


Voxel size = [0.824, 0.824, 2.5] mm

/ Segmentation



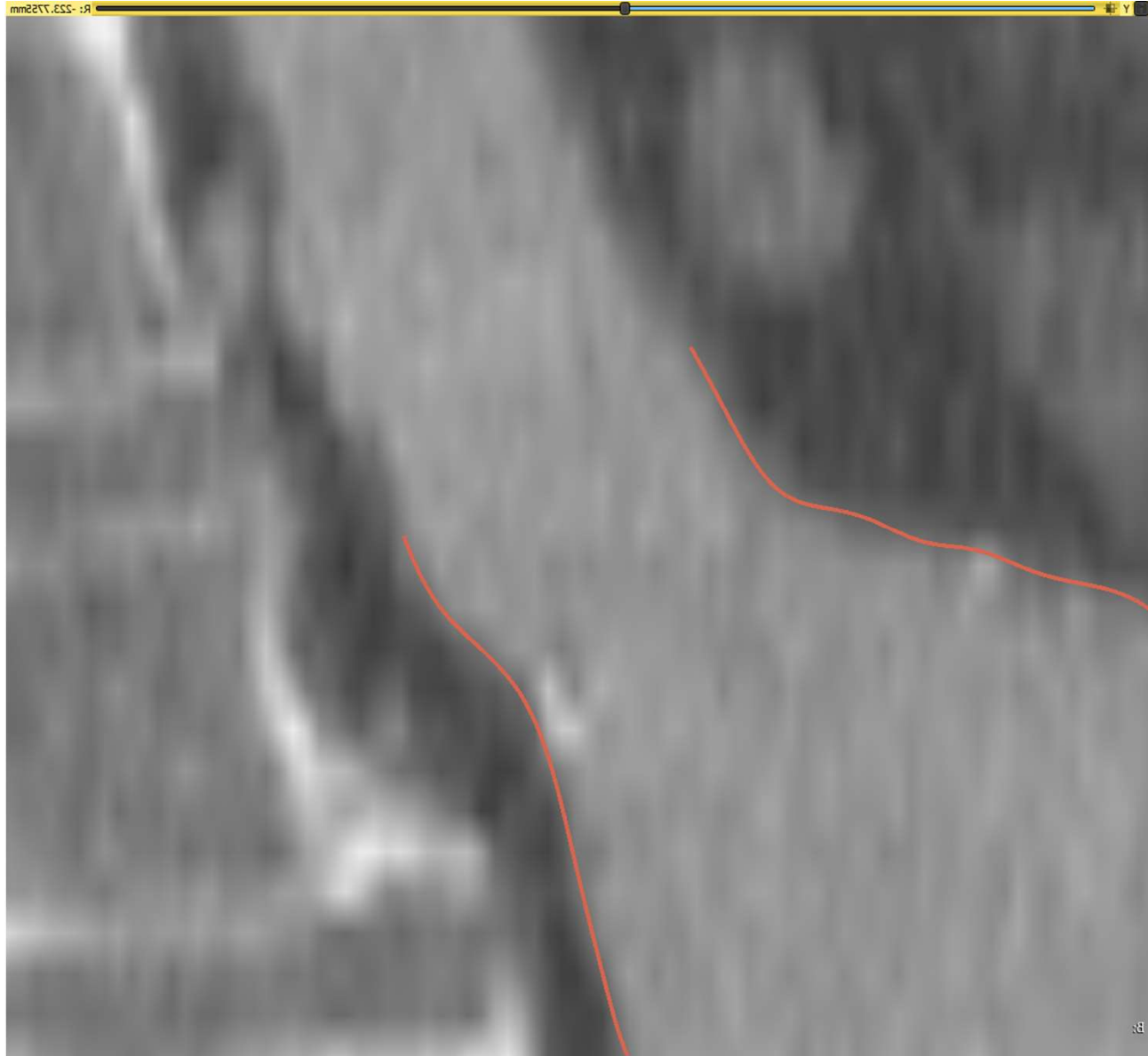
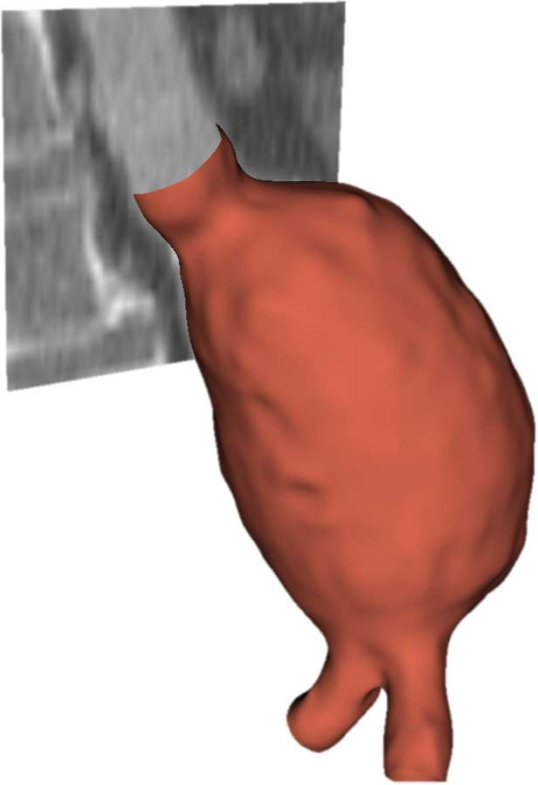
/ Segmentation



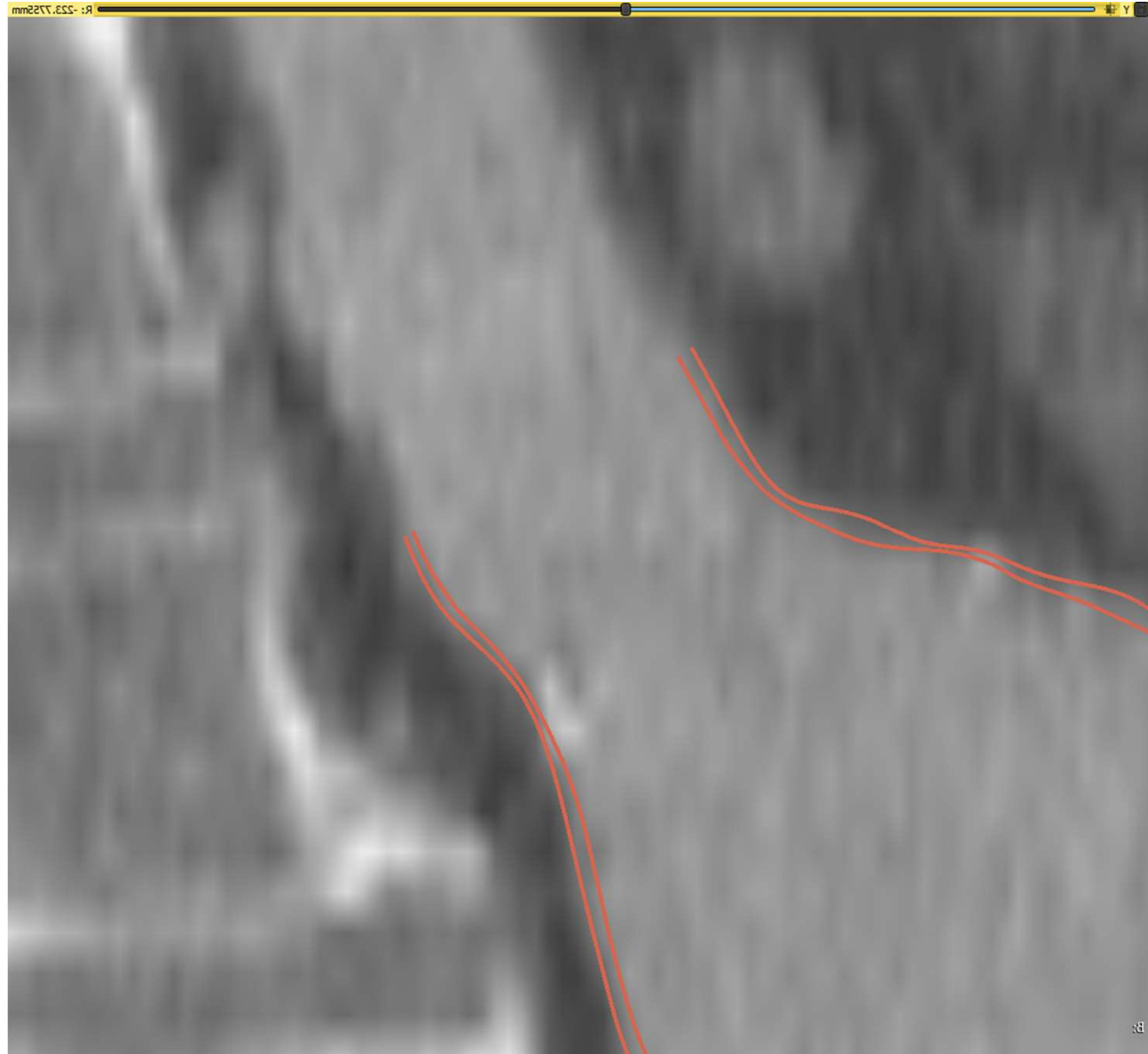
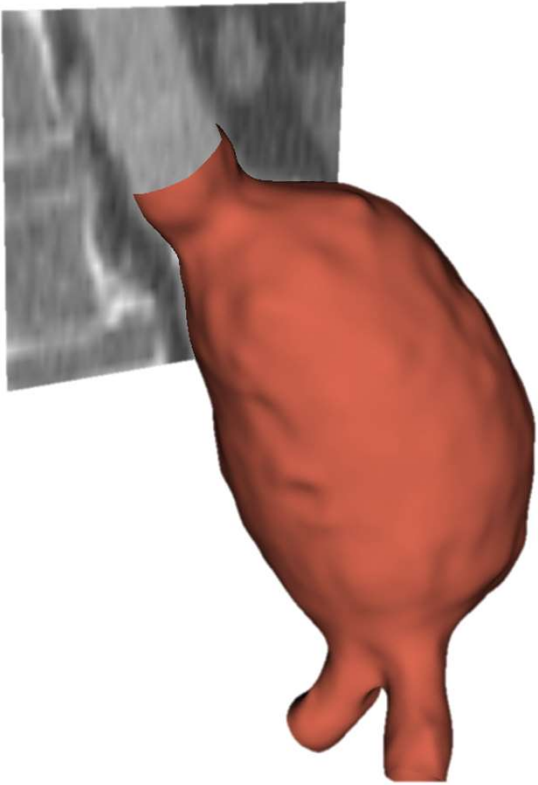
Voxel size = [0.824, 0.824, 2.5] mm



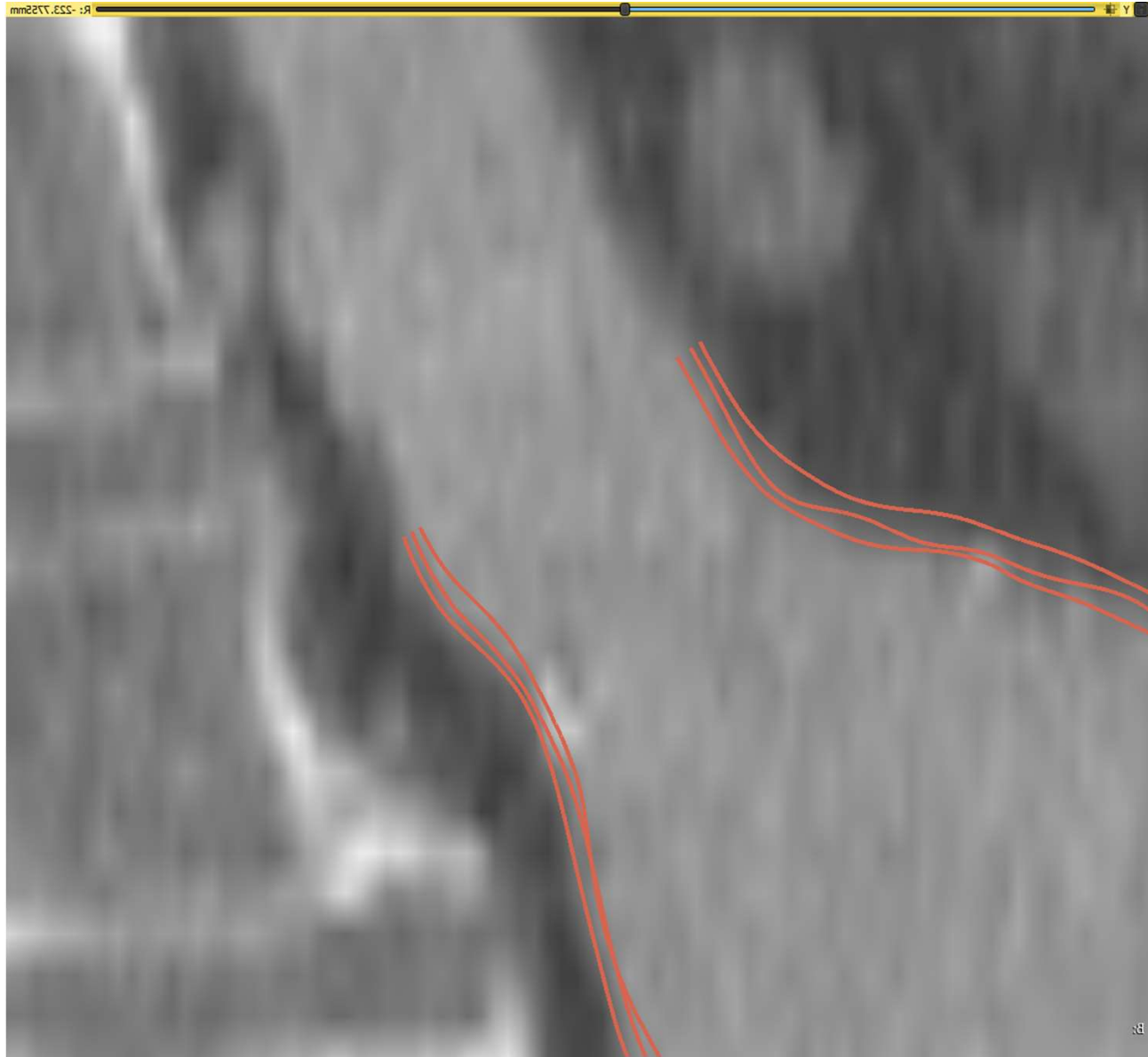
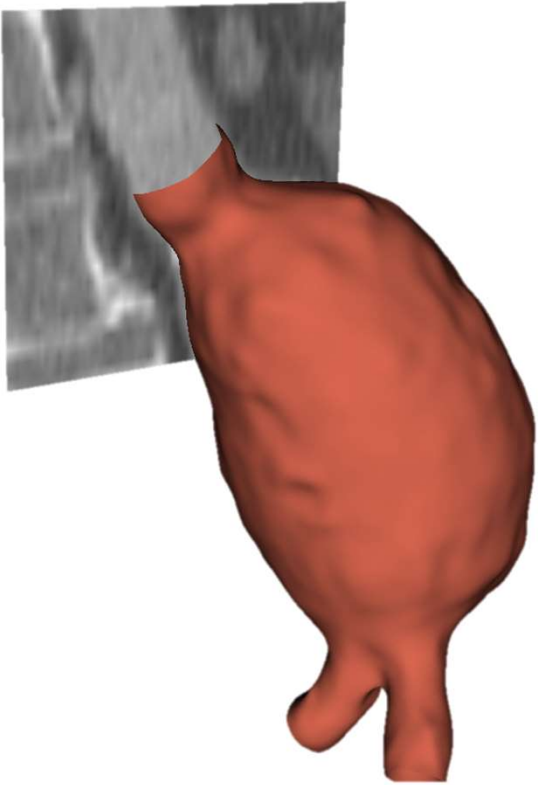
/ Segmentation



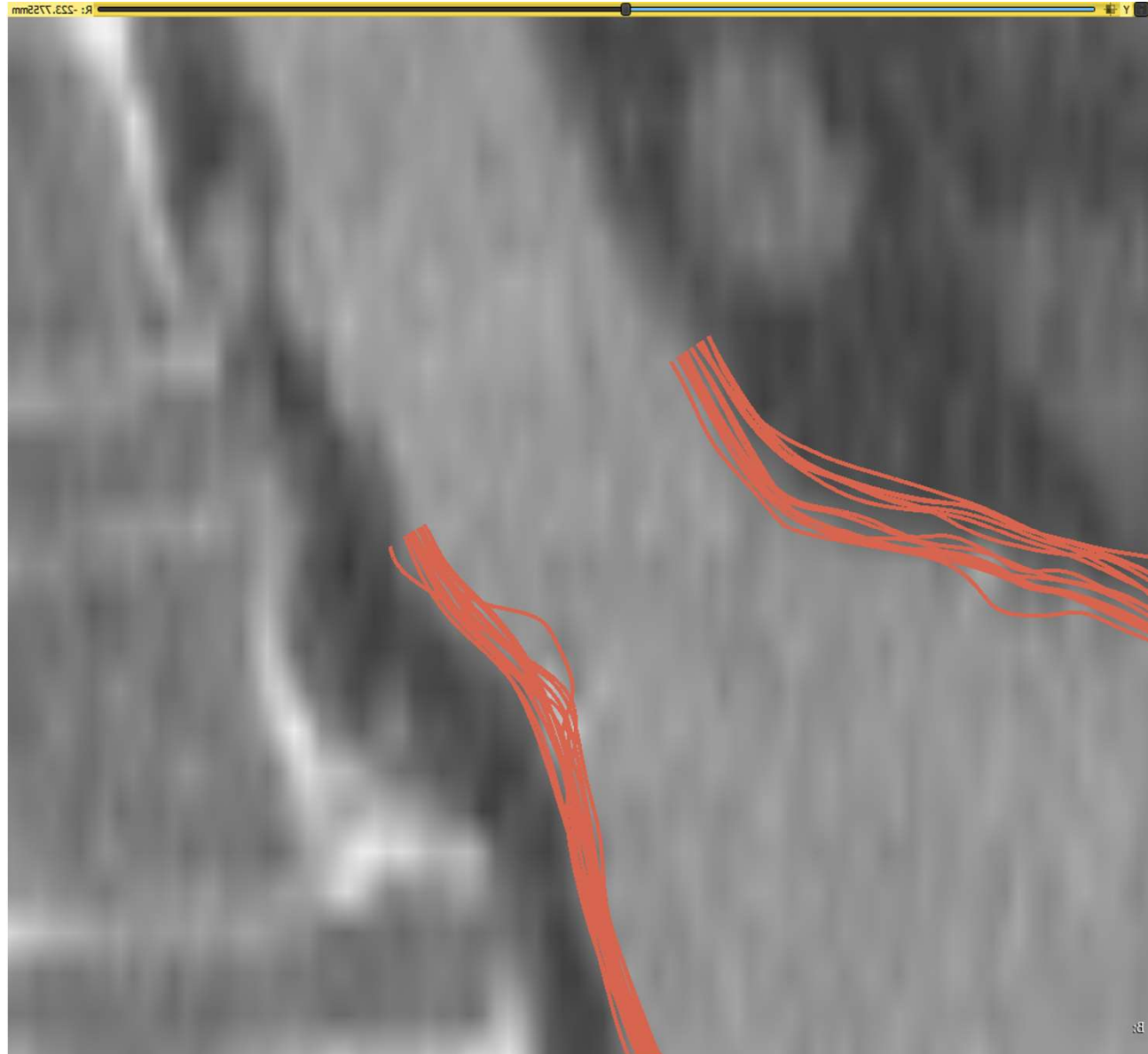
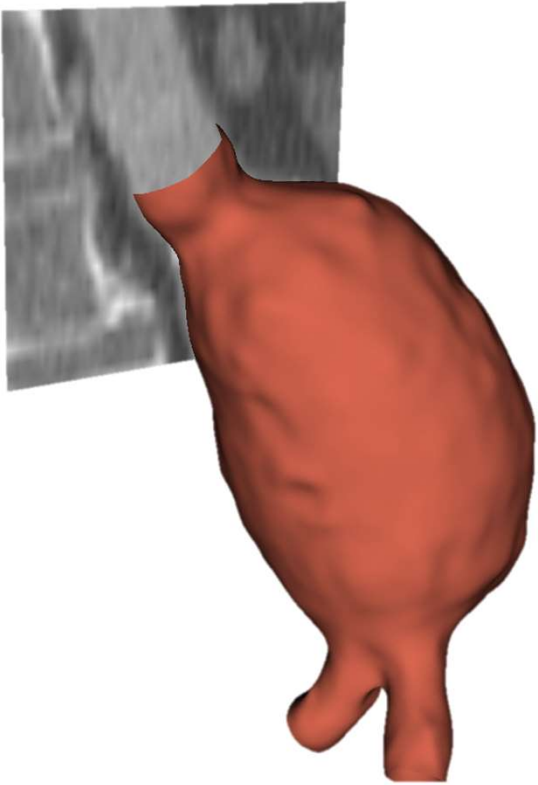
/ Segmentation



/ Segmentation



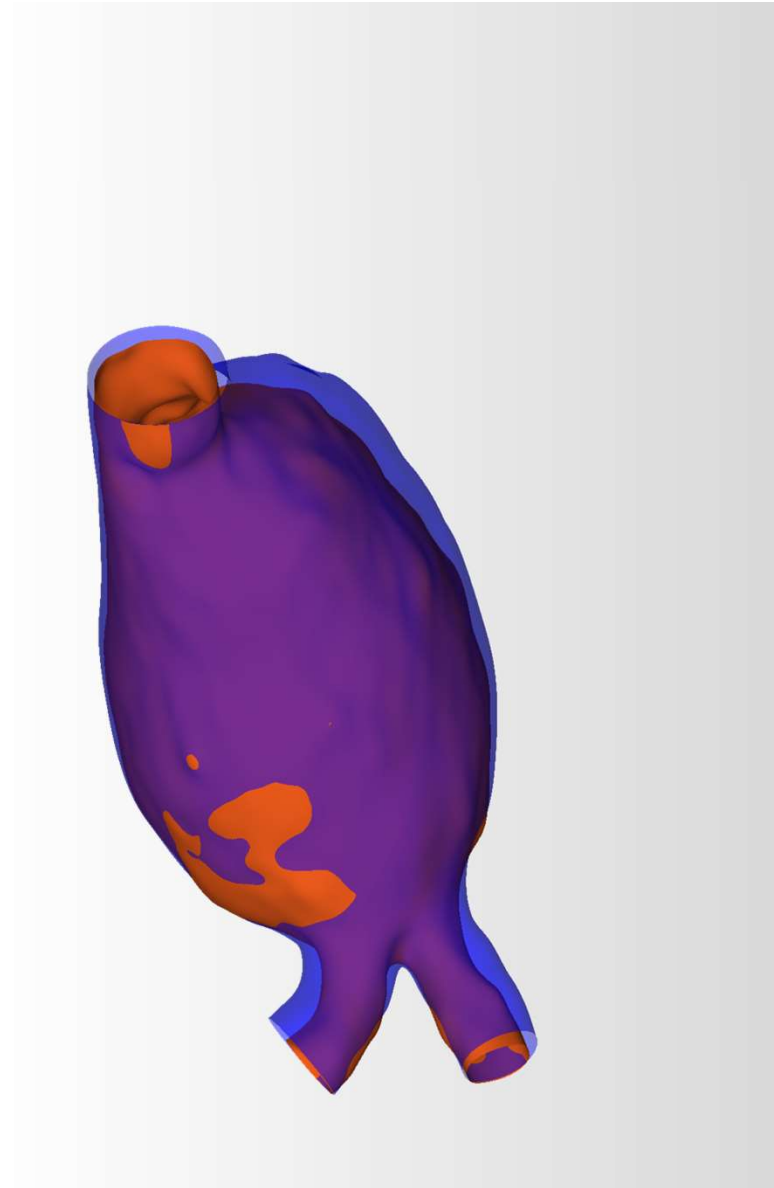
/ Segmentation



/ Geometric Variability

▶ Isotopological mesh

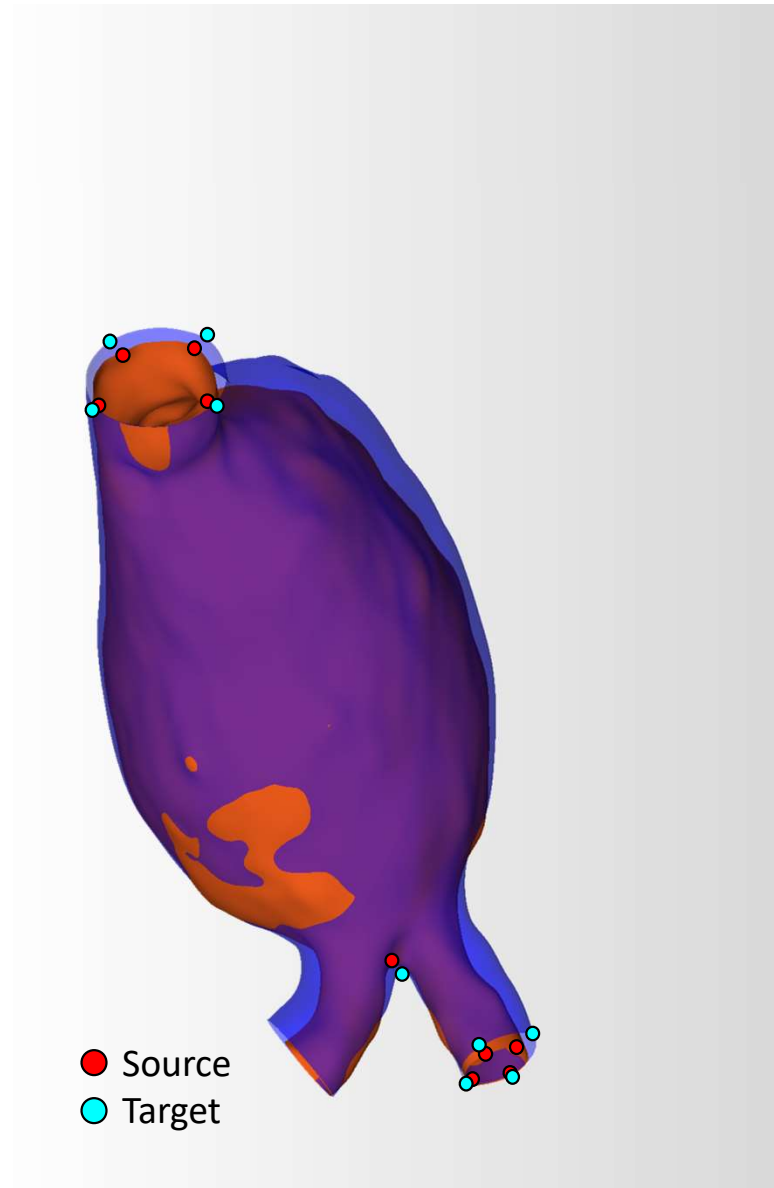
Mesh morphing technique based on landmarks and projection using **rbf**.



/ Geometric Variability

► Isotopological mesh

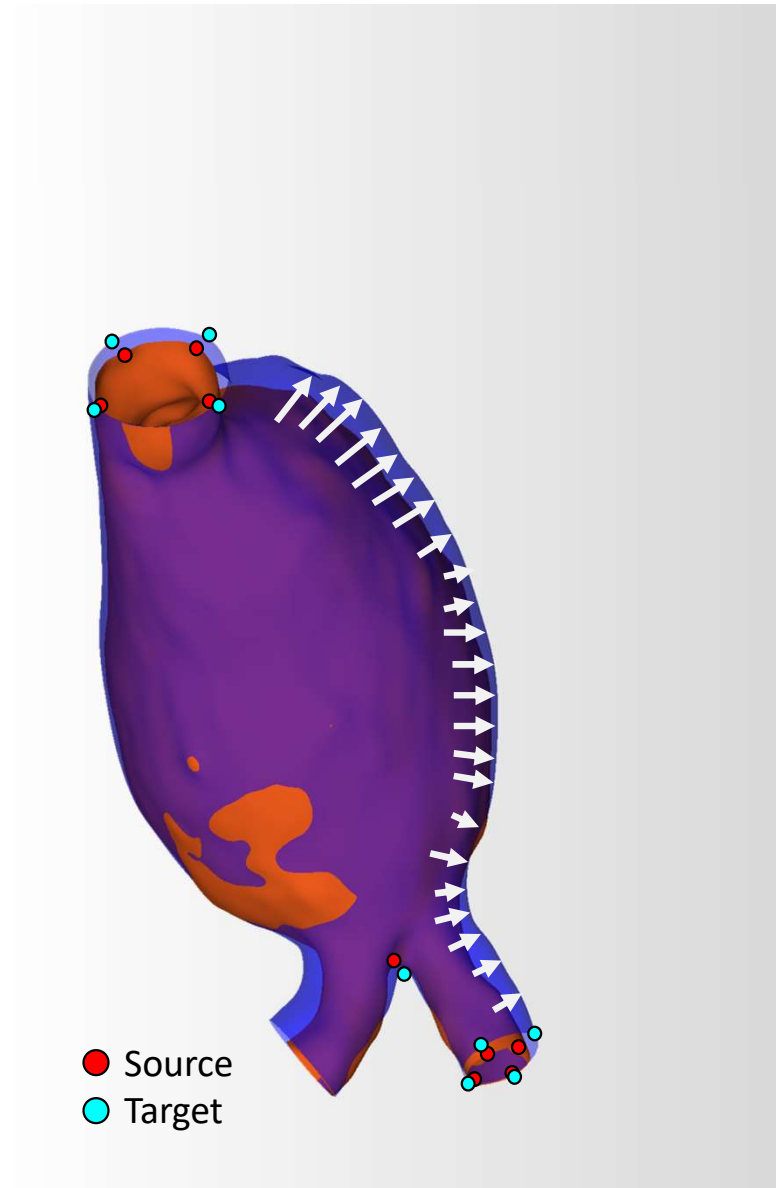
Mesh morphing technique based on landmarks and projection using **rbf**.



/ Geometric Variability

► Isotopological mesh

Mesh morphing technique based on landmarks and projection using **rbf**.

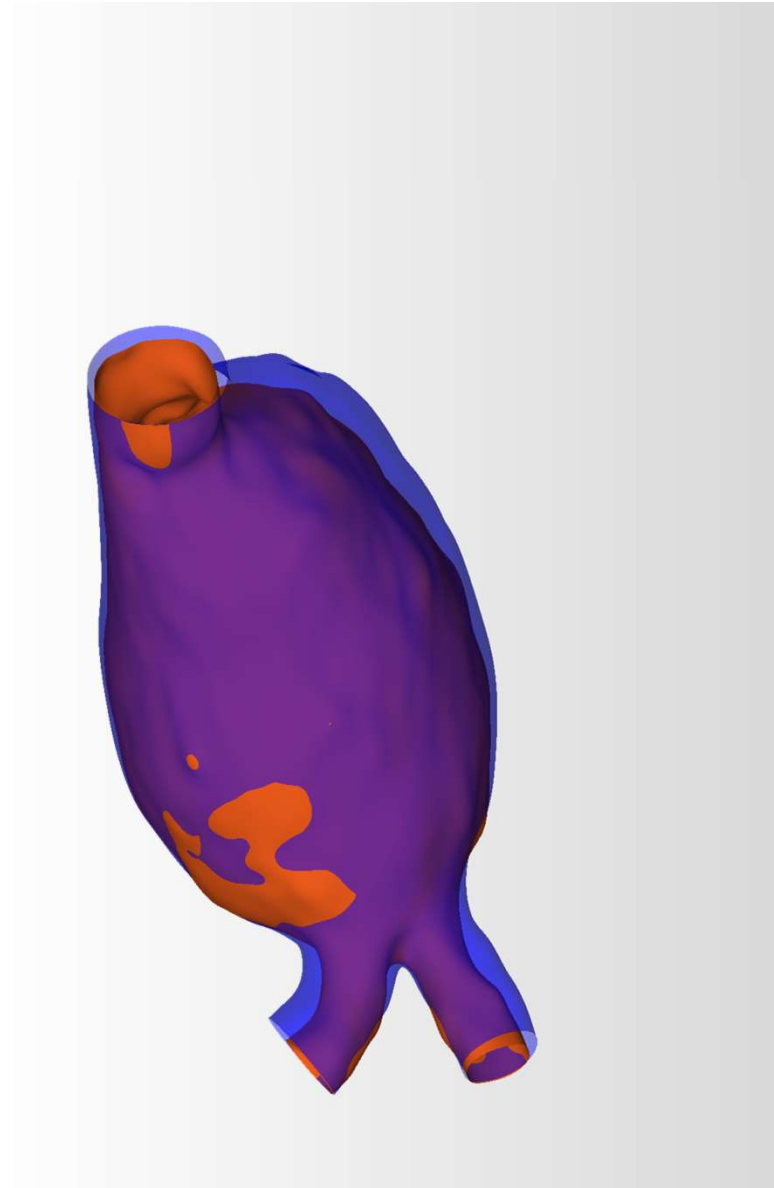


/ Geometric Variability

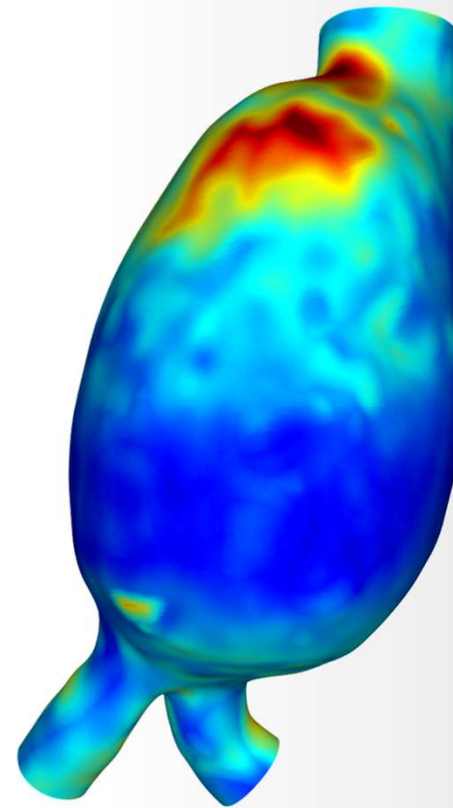
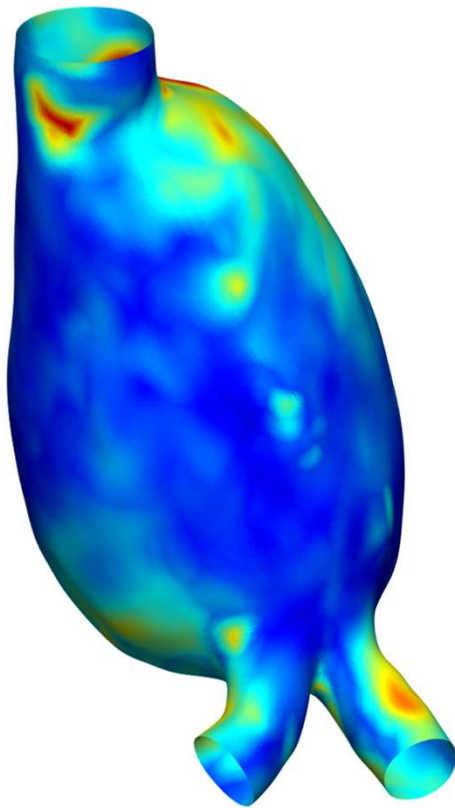
▶ Isotopological mesh

Mesh morphing technique based on landmarks and projection using **rbf**.

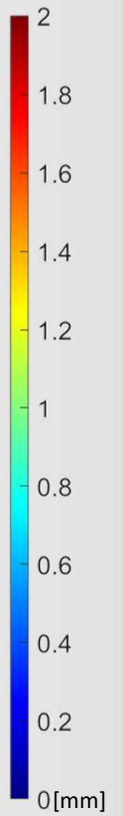
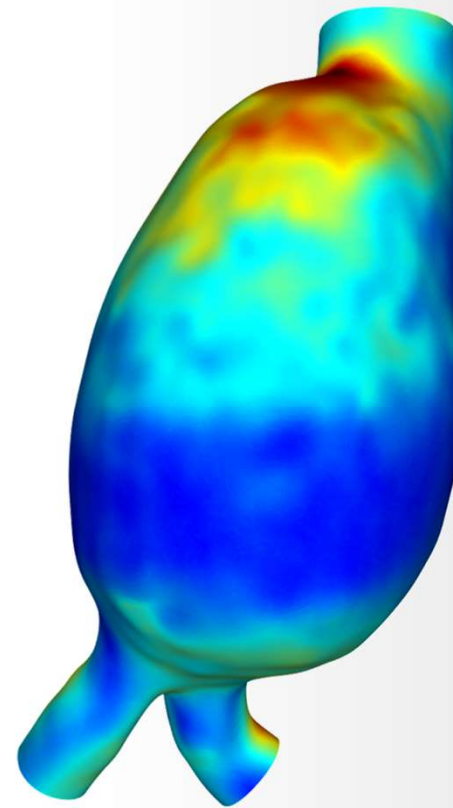
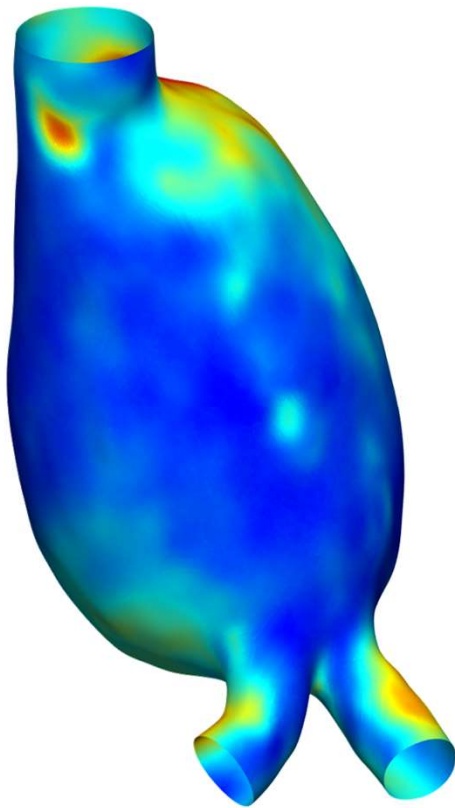
- ▶ Maximum deviation
- ▶ Standard deviation
- ▶ Statistical Shape Model



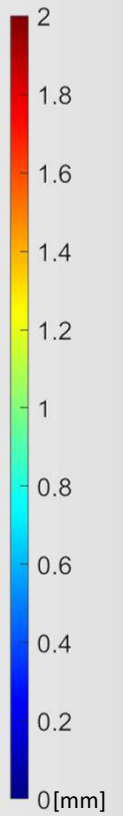
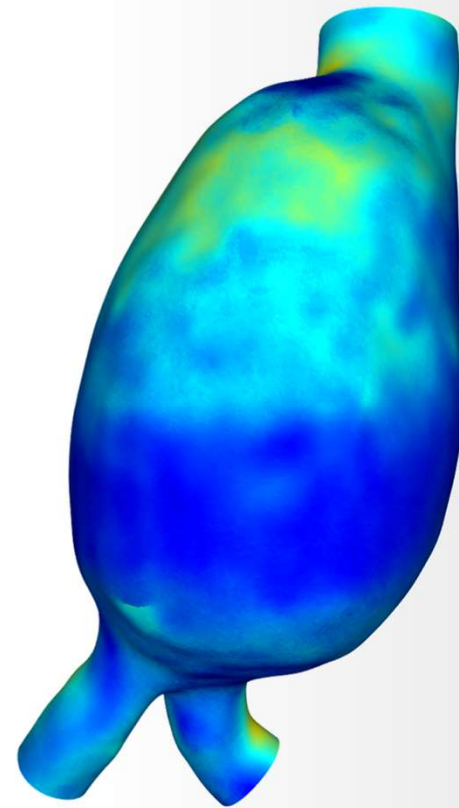
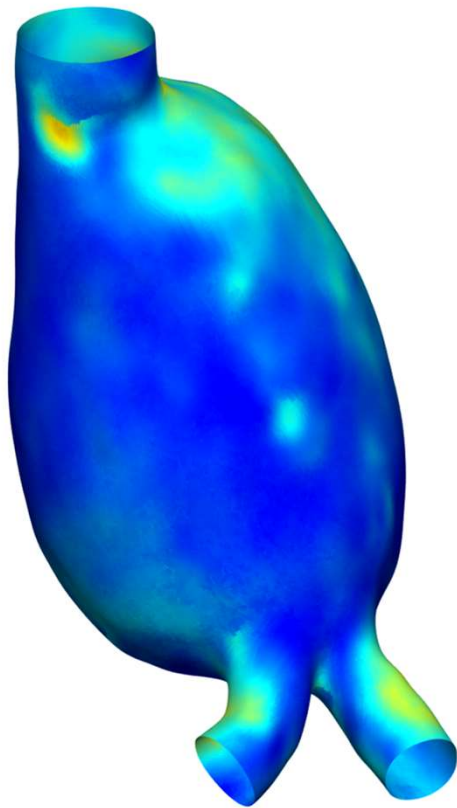
/ Geometric Variability: Maximum Deviation



/ Geometric Variability: Standard Deviation

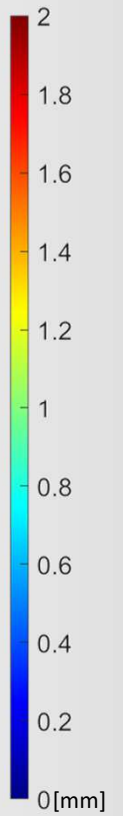
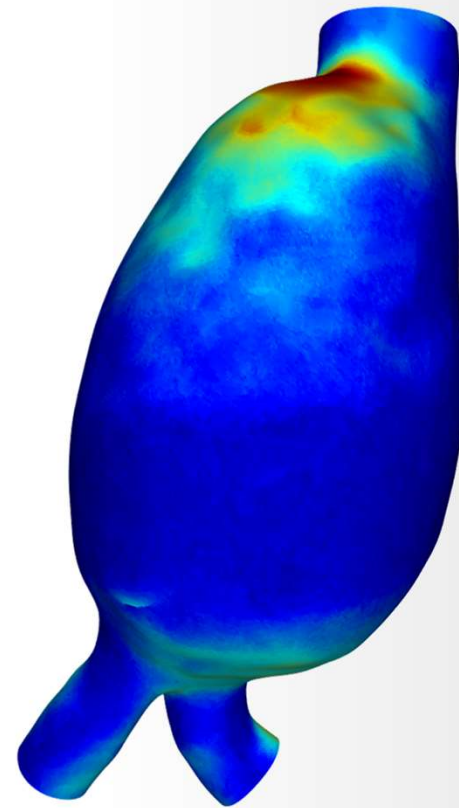
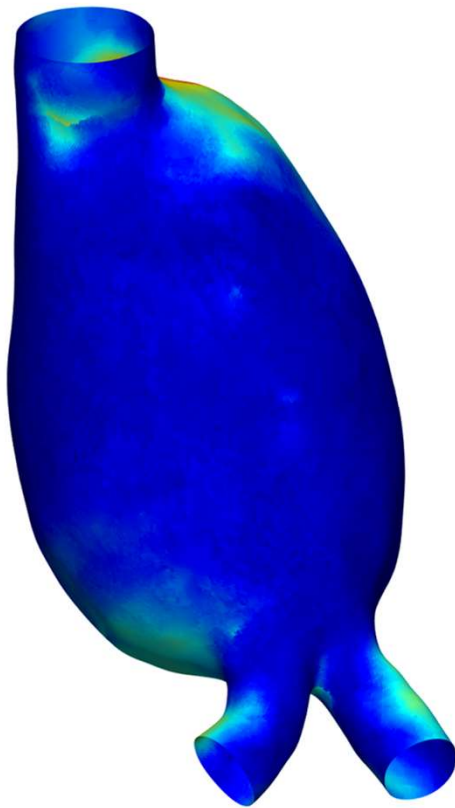


/ Geometric Variability: Standard Deviation XY



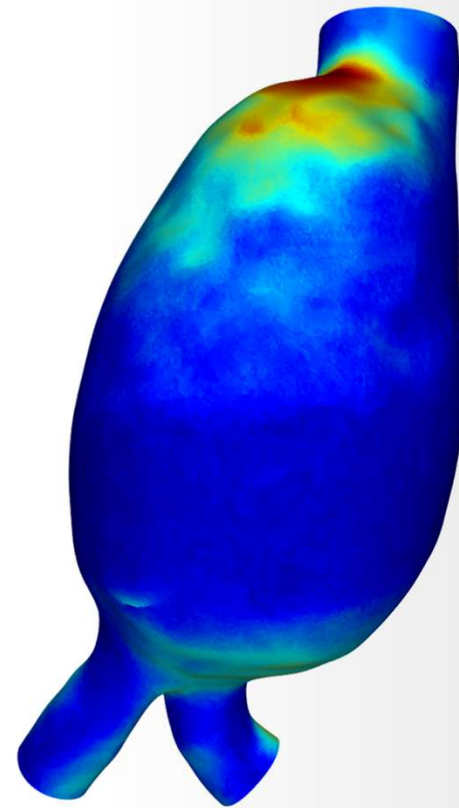
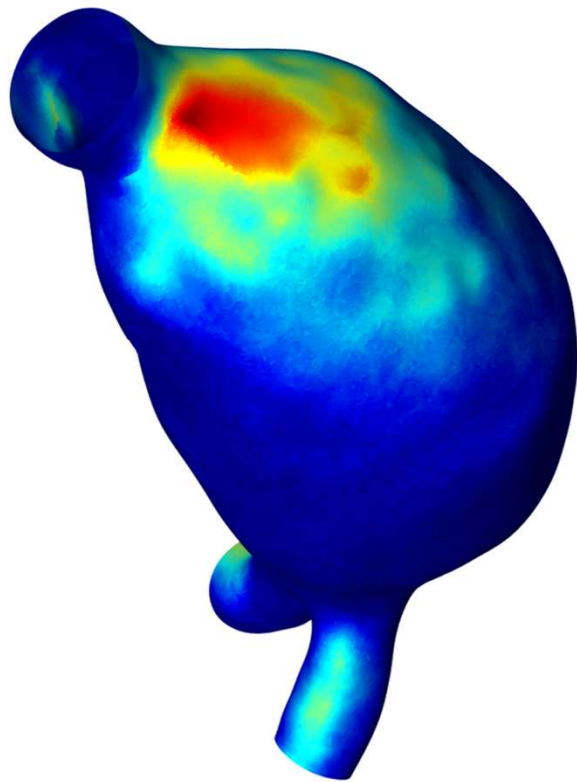
/ Geometric Variability: Standard Deviation Z

Voxel size = [0.824, 0.824, 2.5] mm



/ Geometric Variability: Standard Deviation Z

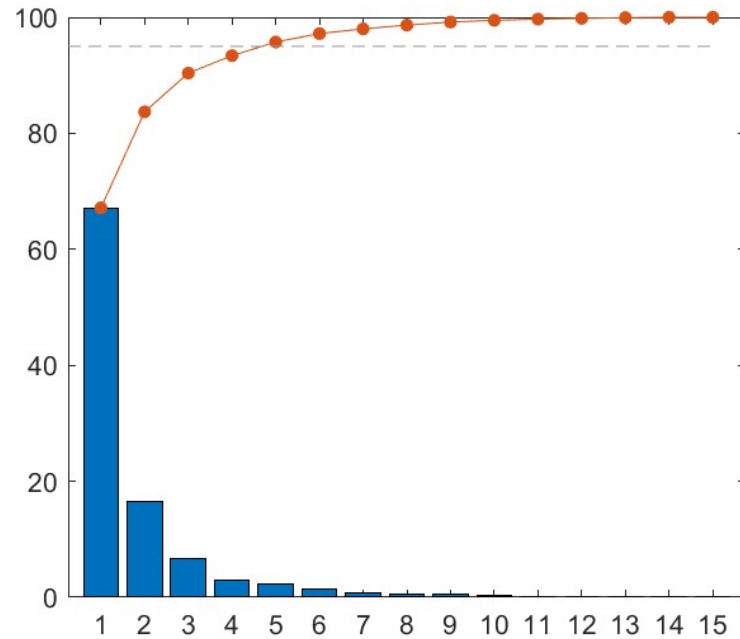
Voxel size = [0.824, 0.824, 2.5] mm



/ Geometric Variability: Statistical Shape Model

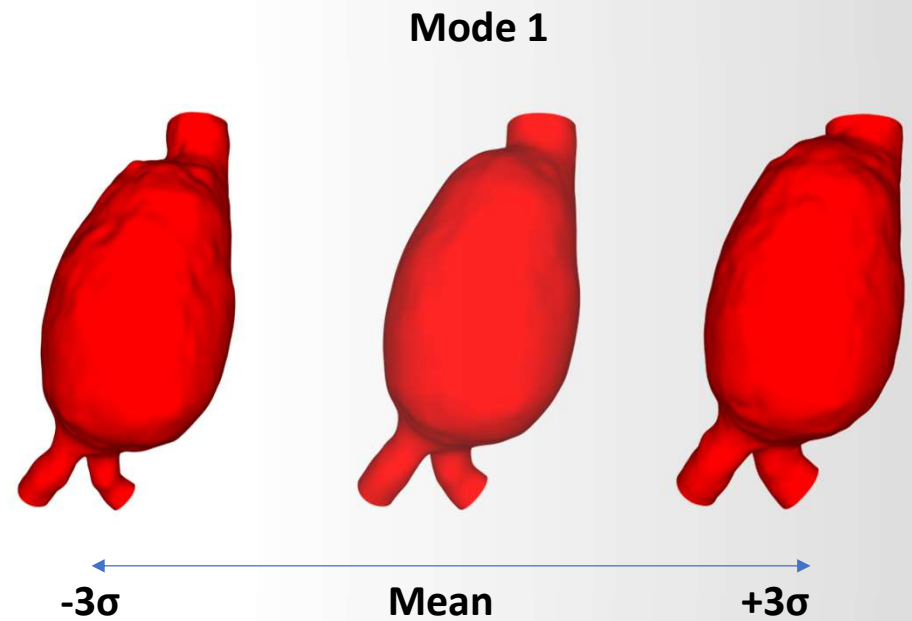
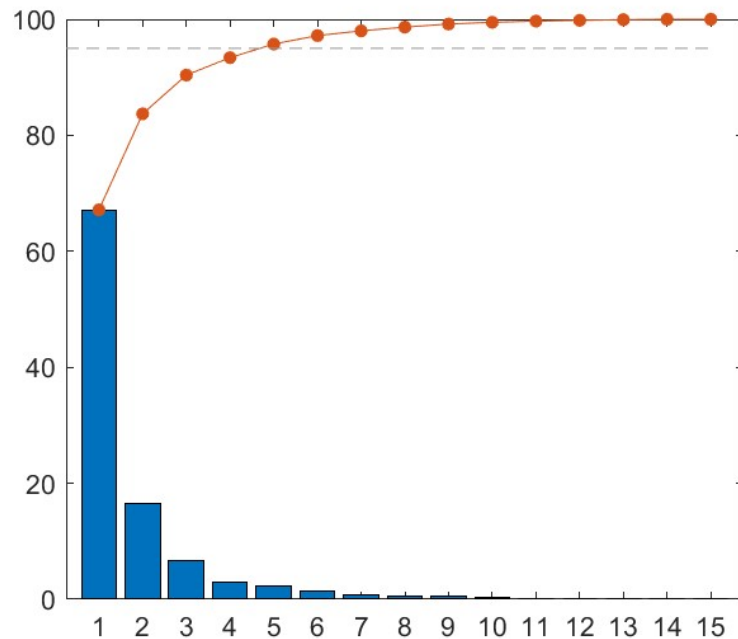
/ Geometric Variability: Statistical Shape Model

▶ **With 5 modes we capture 95.7% of the variance**



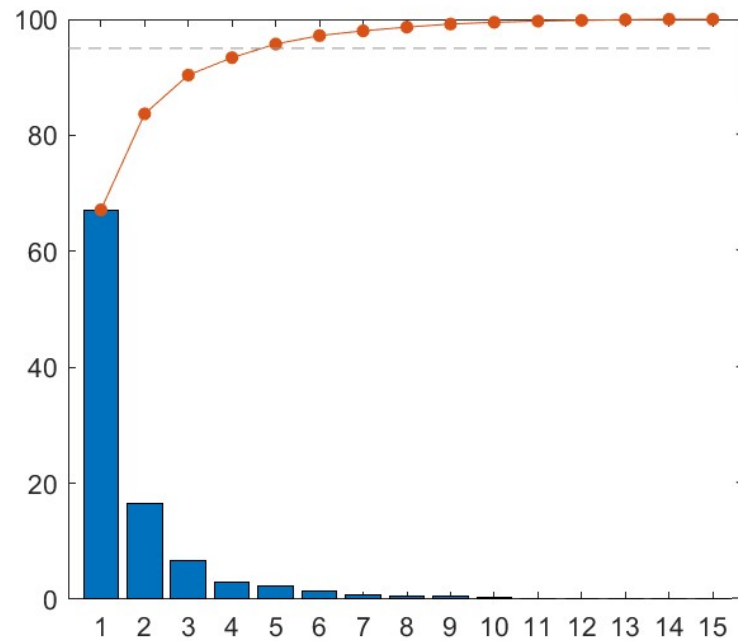
Geometric Variability: Statistical Shape Model

► With 5 modes we capture 95.7% of the variance

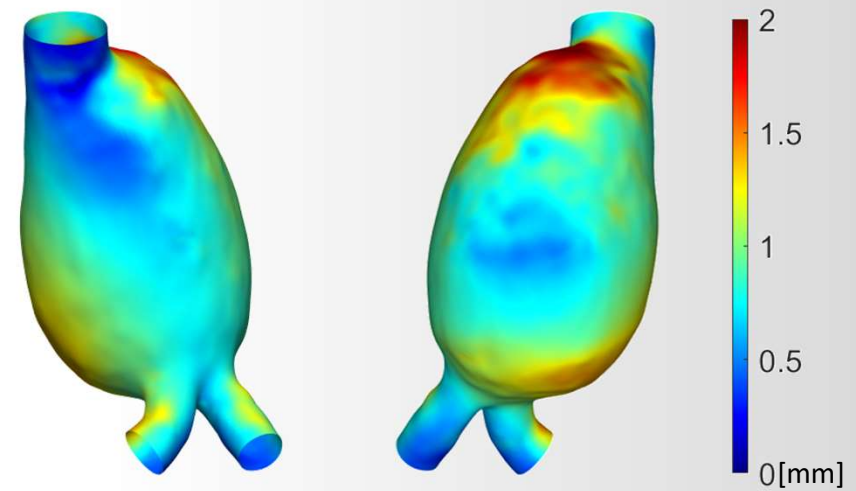


Geometric Variability: Statistical Shape Model

- ▶ With 5 modes we capture 95.7% of the variance



Mode 1
Displacements for 1σ



/ Hemodynamic Variability: Steady

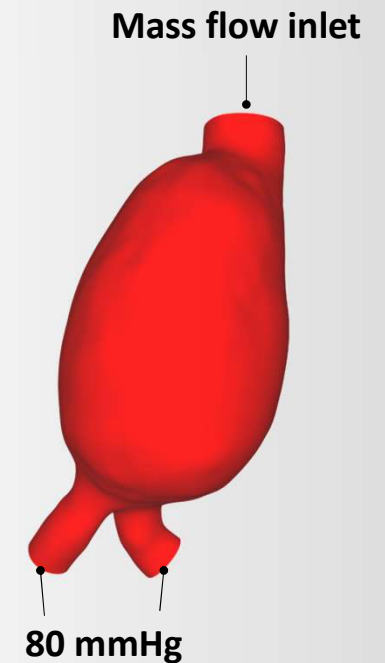
/ Hemodynamic Variability: Steady

Analysis of WSS, pressure drop, and outlet velocity

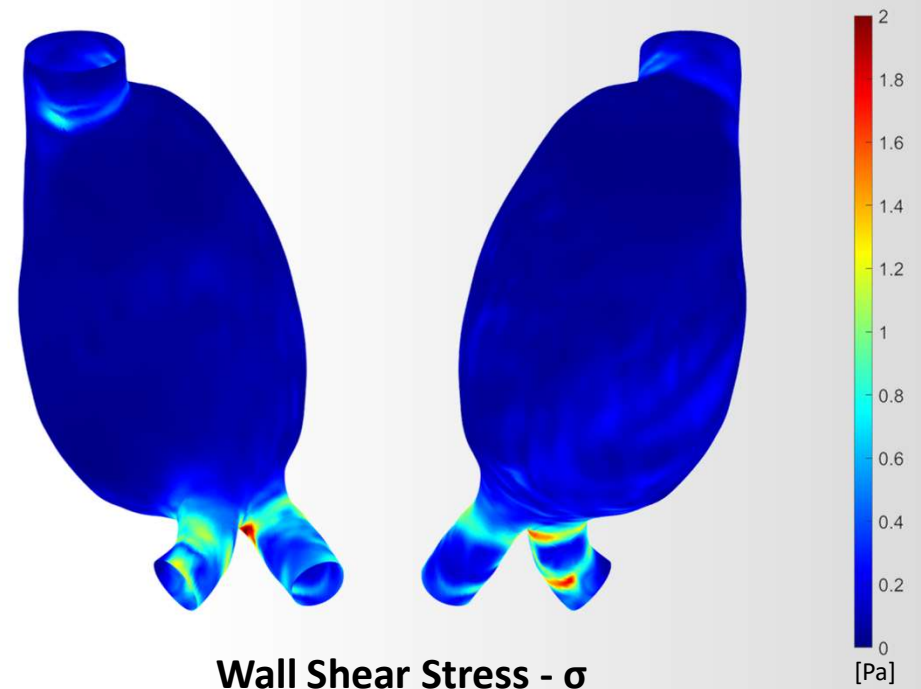
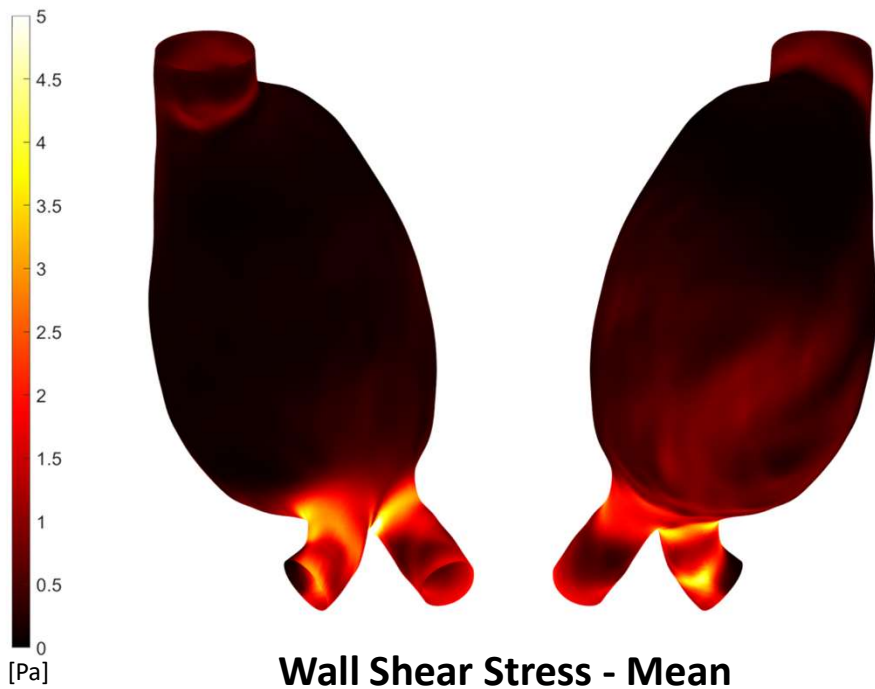
Setup:

- 3 steady state case: 50, 100 and 150 ml/s
- Outlet pressure = 80 mmHg
- Laminar
- Carreau non-newtonian fluid

($\rho = 1056 \text{ kg/m}^3, \mu_\infty = 0.0035 \text{ Pa}\cdot\text{s}, \mu_0 = 0.056 \text{ Pa}\cdot\text{s}, \lambda = 3.313 \text{ s}, n = 0.3568$)

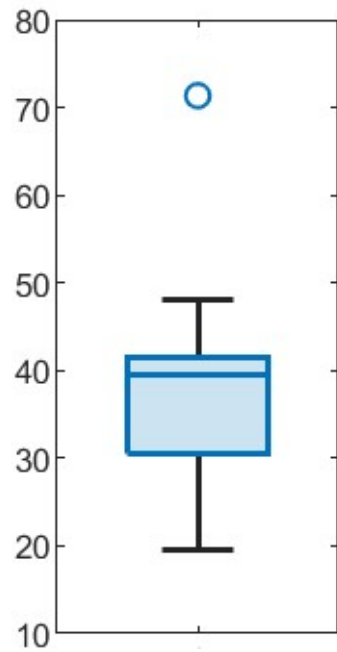


/ Hemodynamic Variability: Steady 50 ml/s

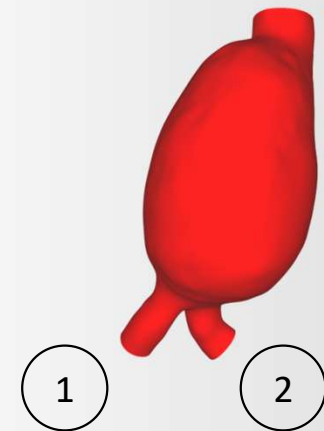
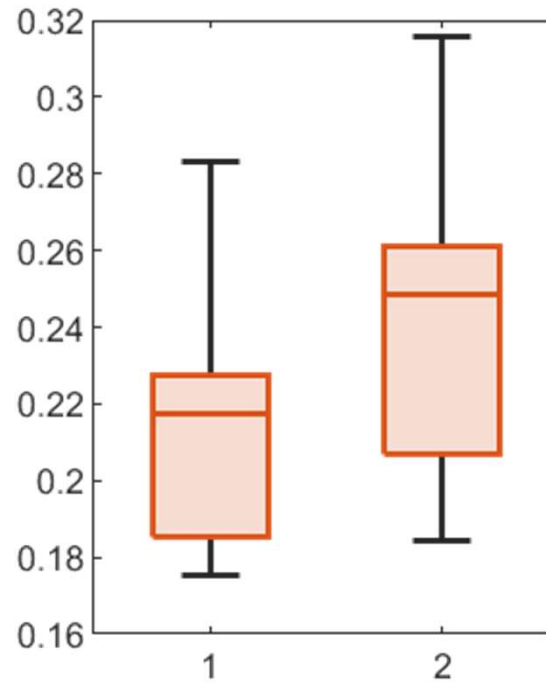


/ Hemodynamic Variability: Steady 50 ml/s

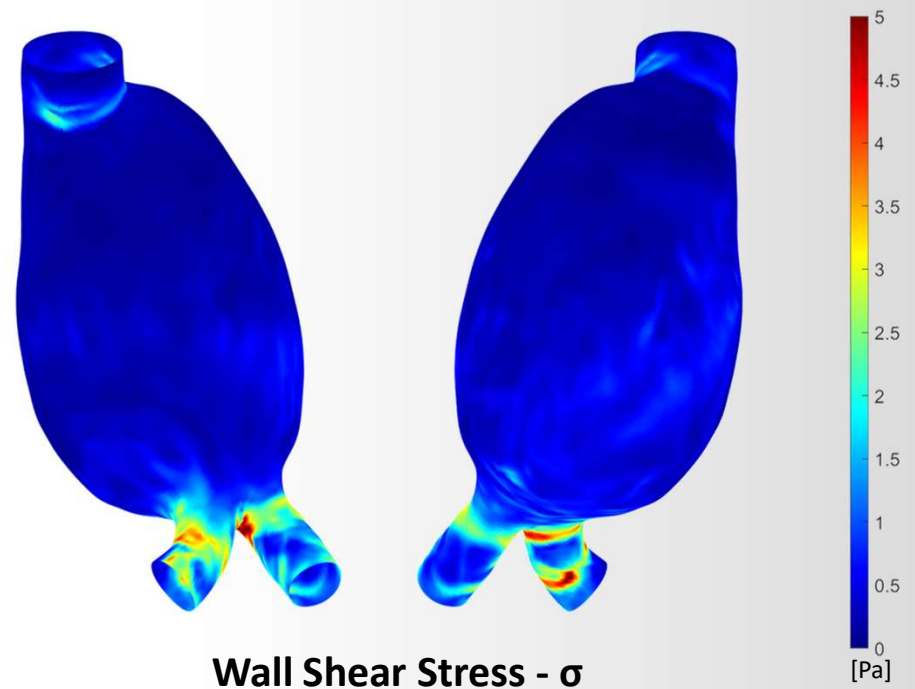
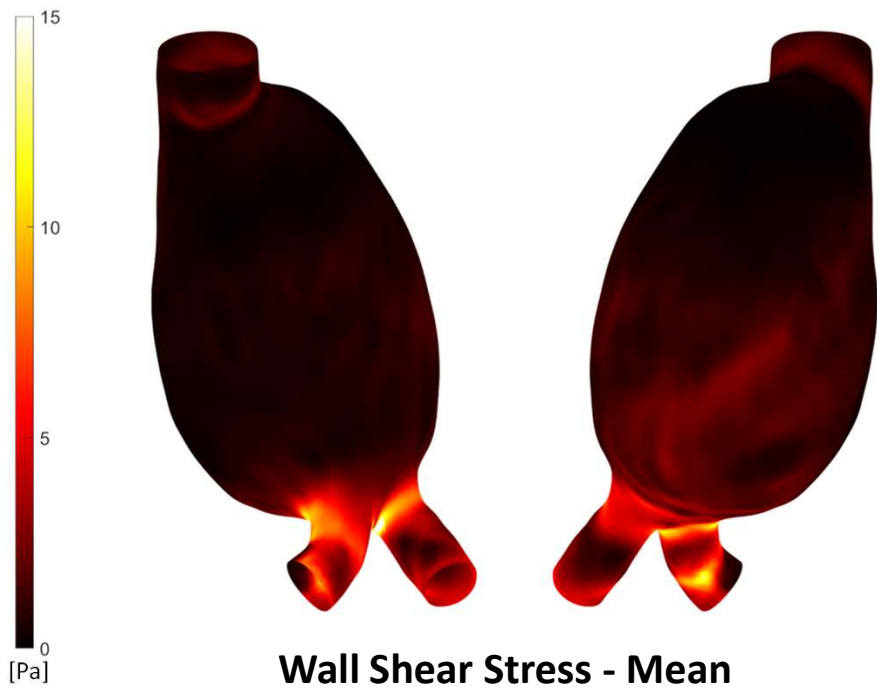
Pressure Drop [Pa]



Outlet Velocity [m/s]

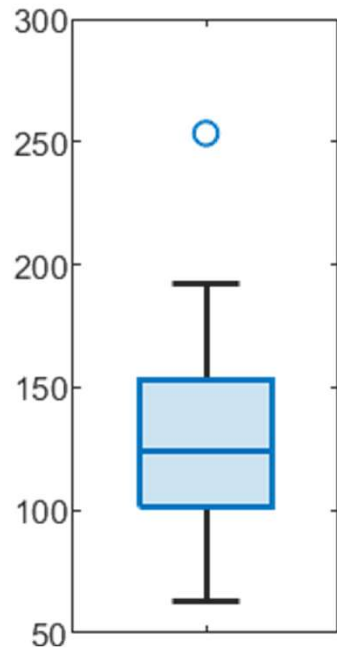


/ Hemodynamic Variability: Steady 100 ml/s

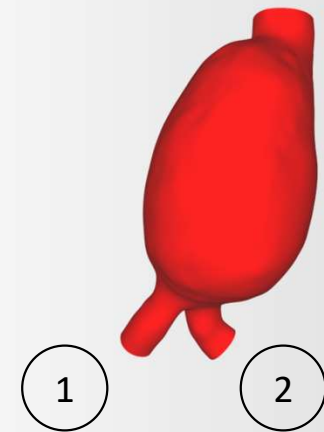
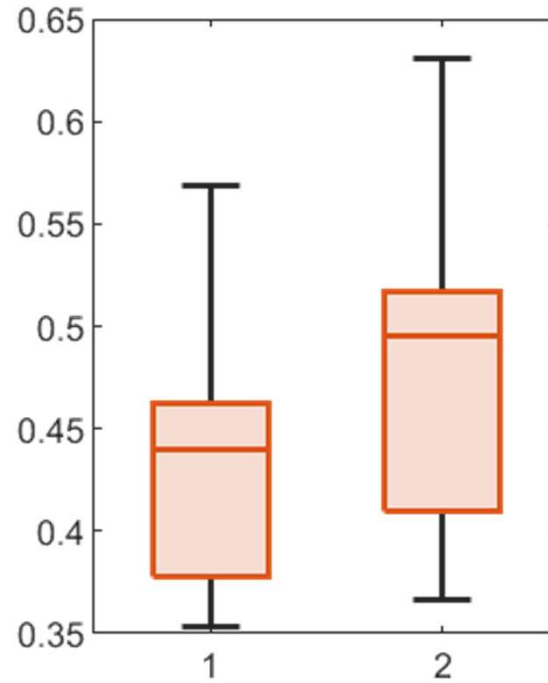


/ Hemodynamic Variability: Steady 100 ml/s

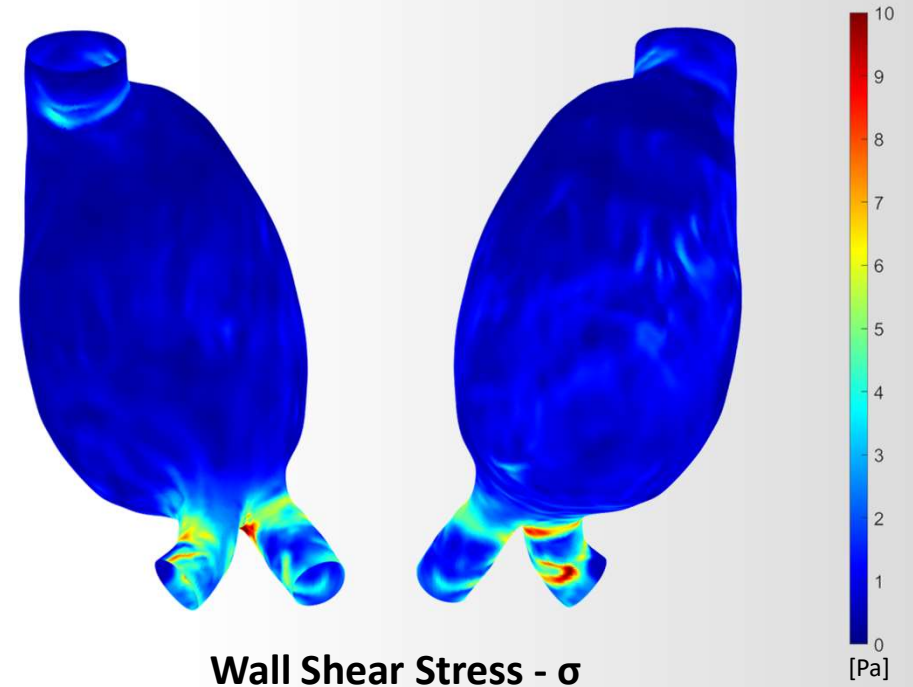
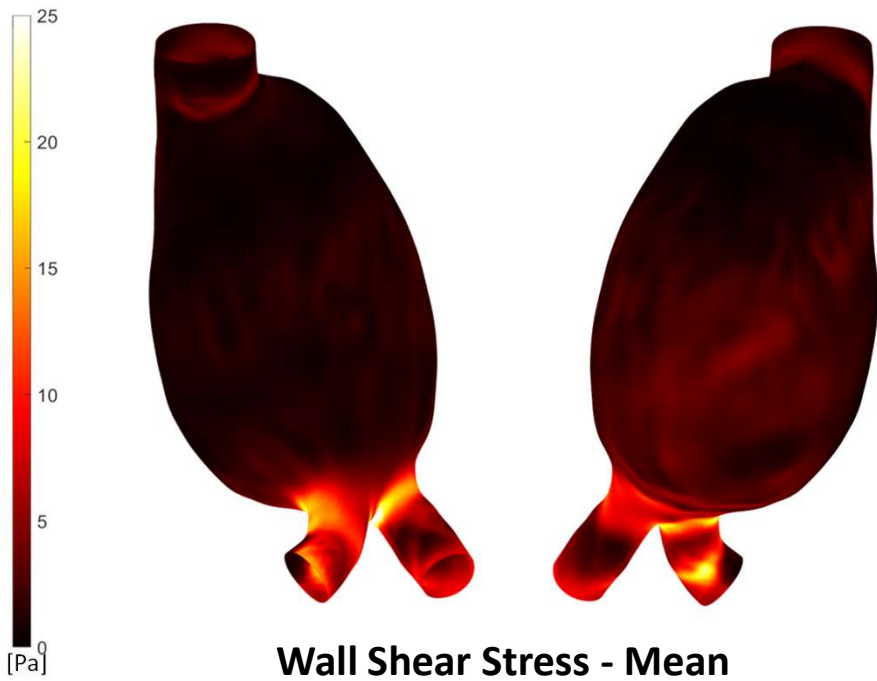
Pressure Drop [Pa]



Outlet Velocity [m/s]

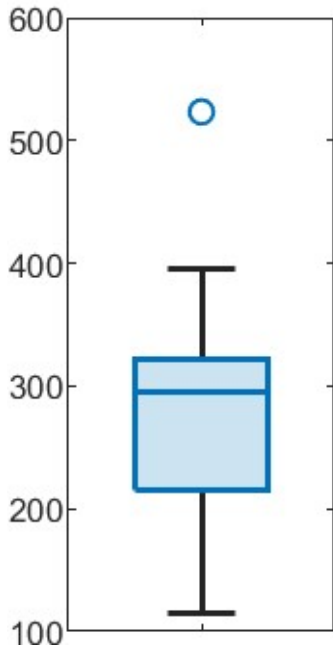


/ Hemodynamic Variability: Steady 150 ml/s

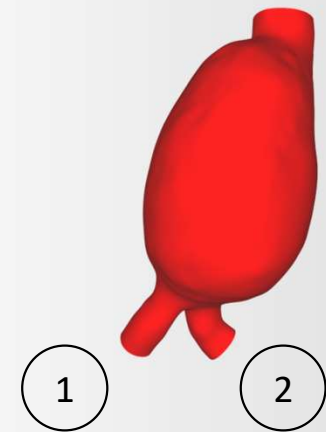
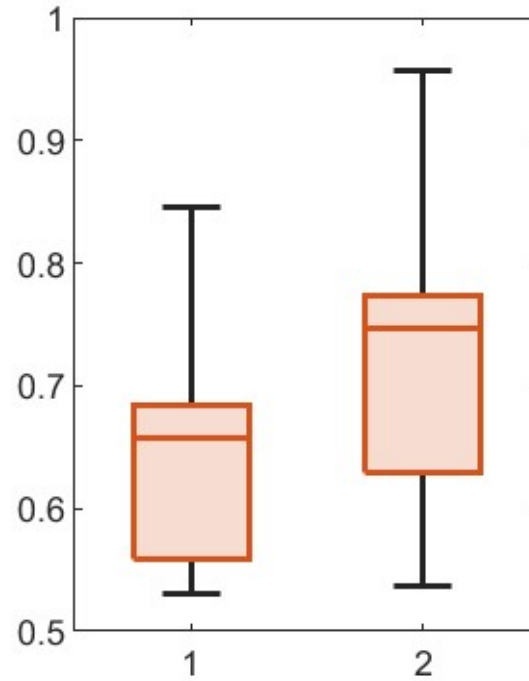


/ Hemodynamic Variability: Steady 150 ml/s

Pressure Drop [Pa]



Outlet Velocity [m/s]



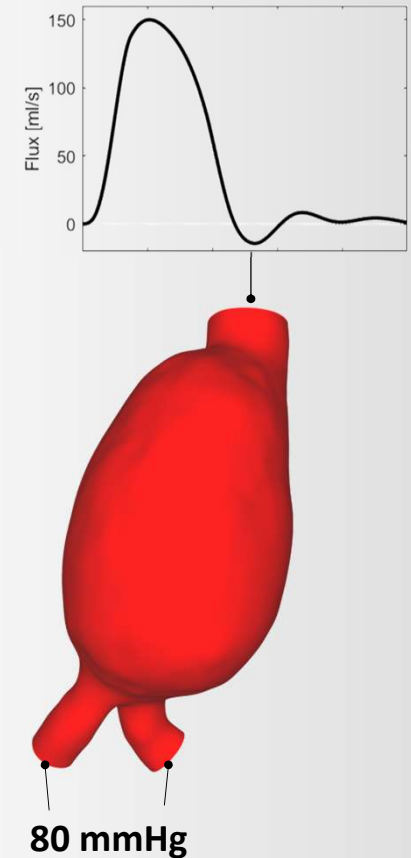
/ Hemodynamic Variability: Transient

/ Hemodynamic Variability: Transient

Analysis of TAWSS, OSI, pressure drop, and outlet flux.

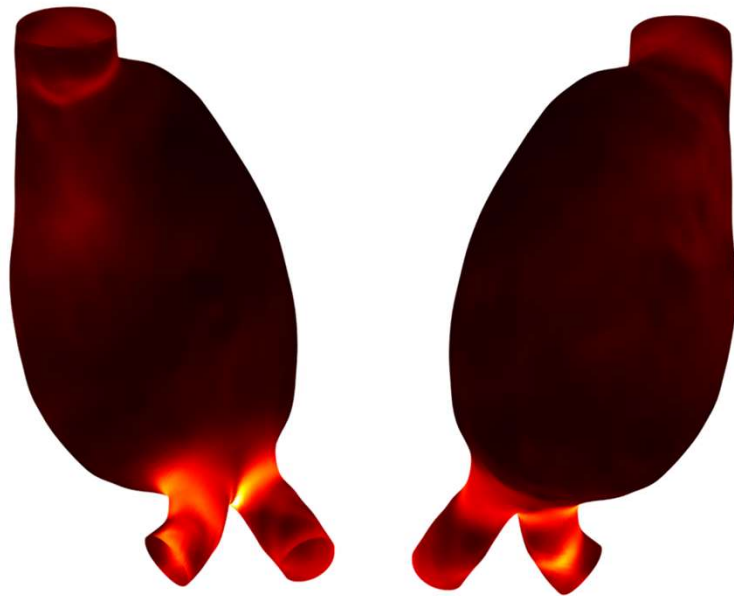
Setup:

- Inlet: imposed mass flow profile
- Outlet pressure constant = 80 mmHg
- Laminar
- Carreau non-newtonian fluid:
($\rho = 1056 \text{ kg/m}^3, \mu_{\infty} = 0.0035 \text{ Pa}\cdot\text{s}, \mu_0 = 0.056 \text{ Pa}\cdot\text{s}, \lambda = 3.313 \text{ s}, n = 0.3568$)
- 4 cardiac cycles



/ Hemodynamic Variability: Transient

$$\text{TAWSS} = \frac{1}{T} \int_0^T |\text{WSS}| dt$$



Time Average WSS - Mean

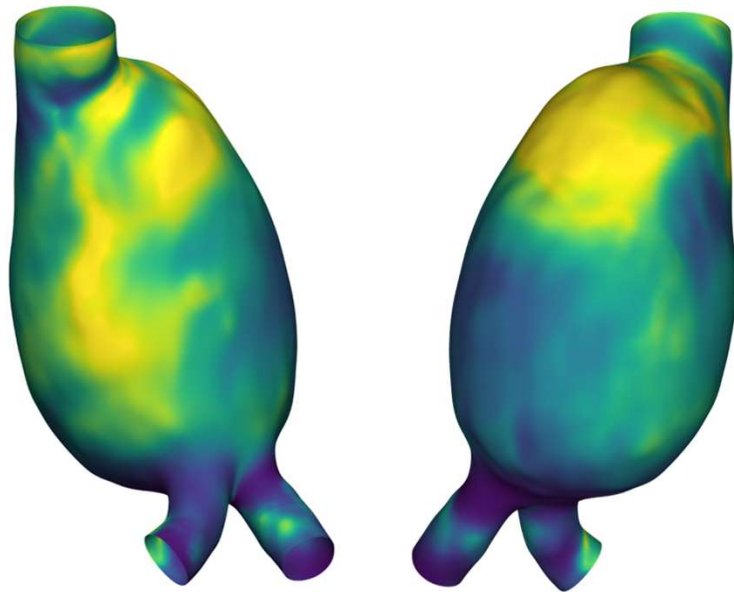


Time Average WSS - σ

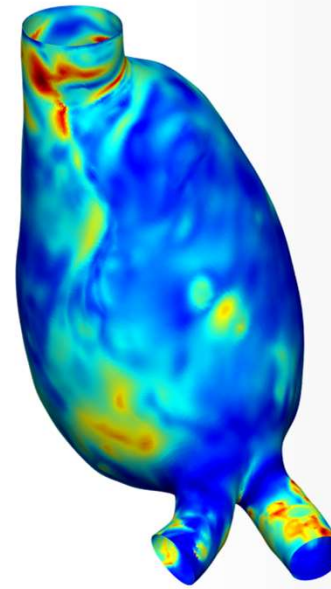


/ Hemodynamic Variability: Transient

$$\text{OSI} = 0.5 \left(1 - \frac{\left| \int_0^T \text{WSS} dt \right|}{\int_0^T |\text{WSS}| dt} \right)$$



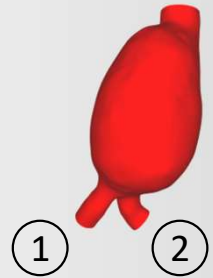
Oscillating Shear Index - Mean



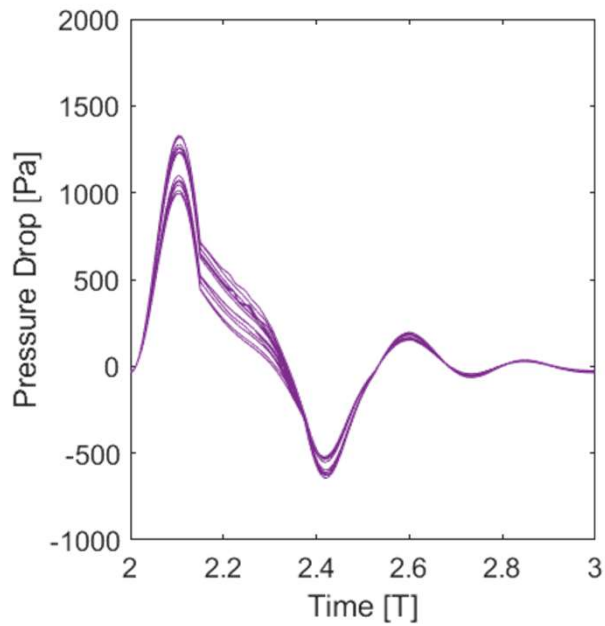
Oscillating Shear Index - σ



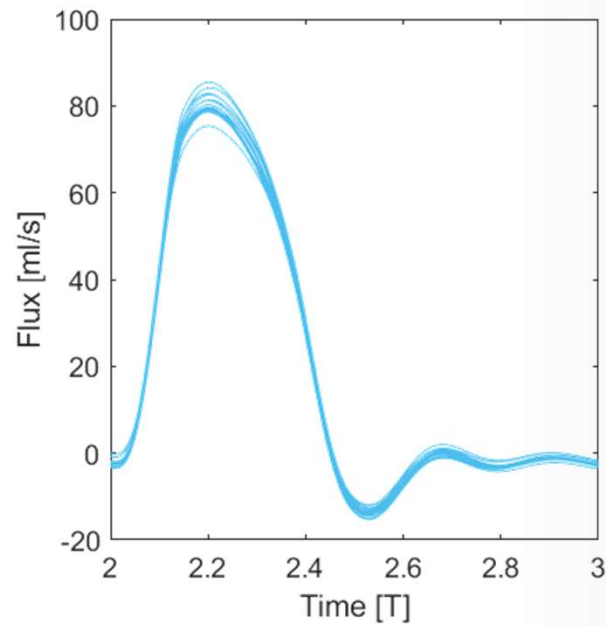
Hemodynamic Variability: Transient



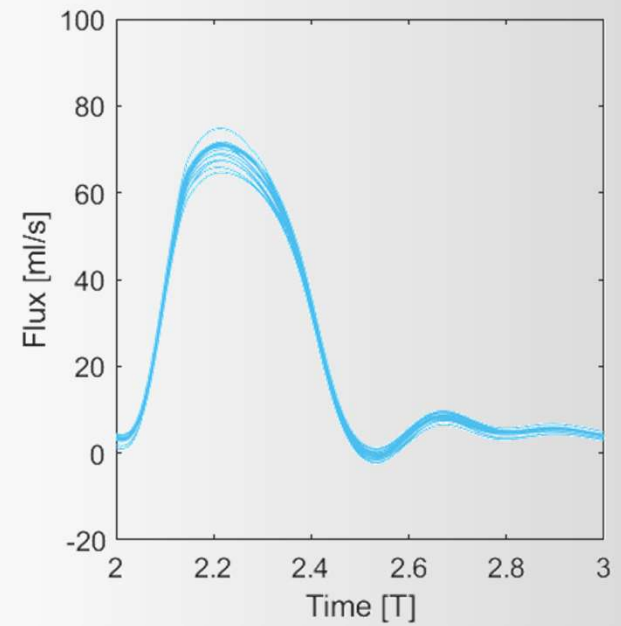
Pressure Drop



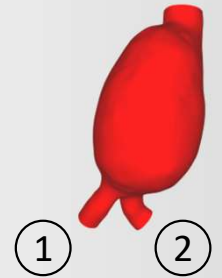
Outlet Flux 1



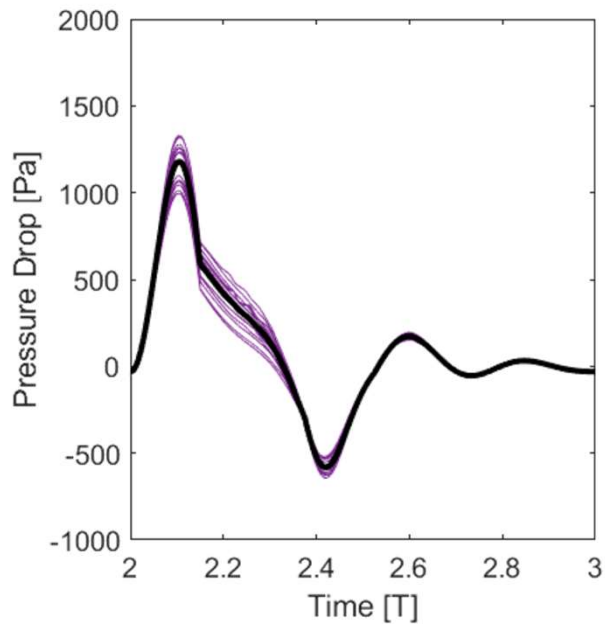
Outlet Flux 2



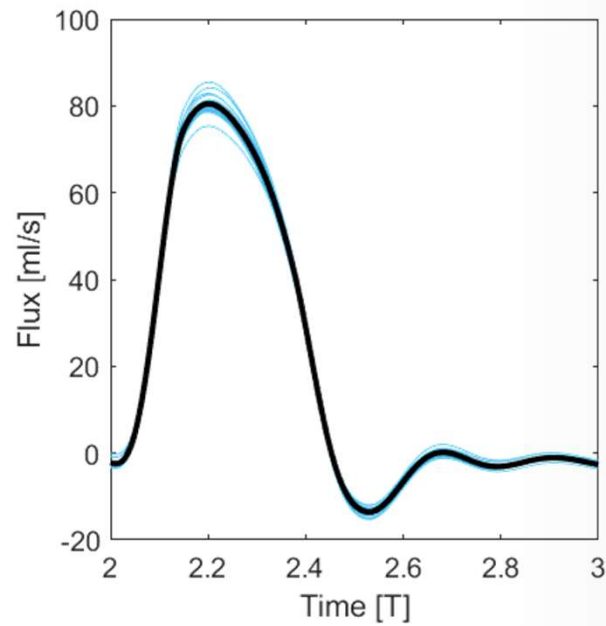
Hemodynamic Variability: Transient



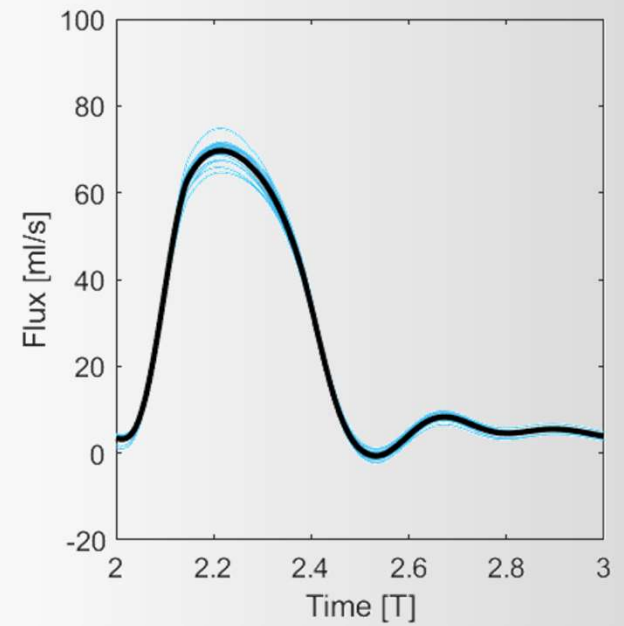
Pressure Drop



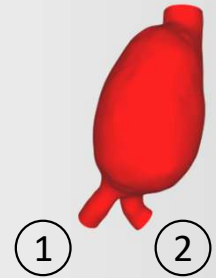
Outlet Flux 1



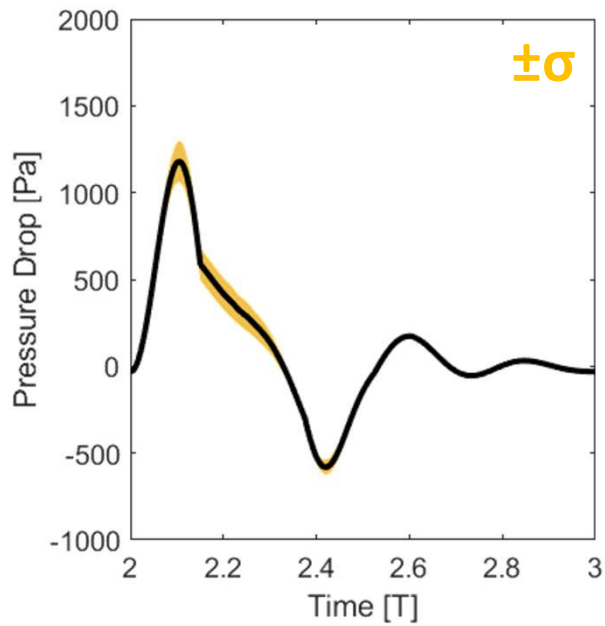
Outlet Flux 2



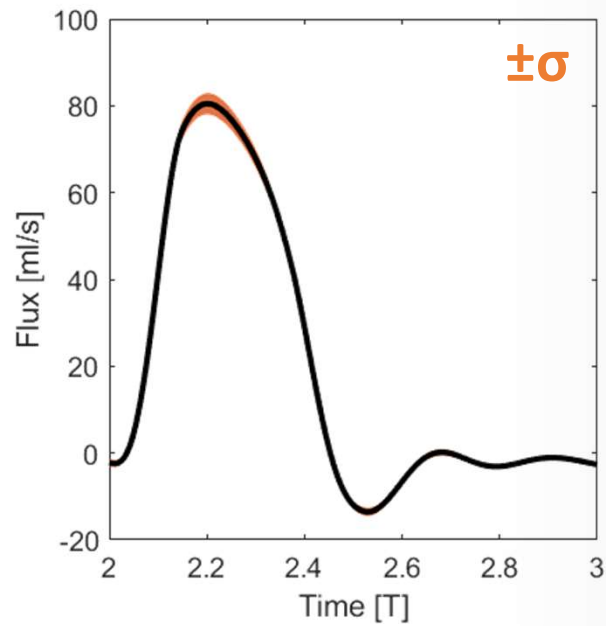
/ Hemodynamic Variability: Transient



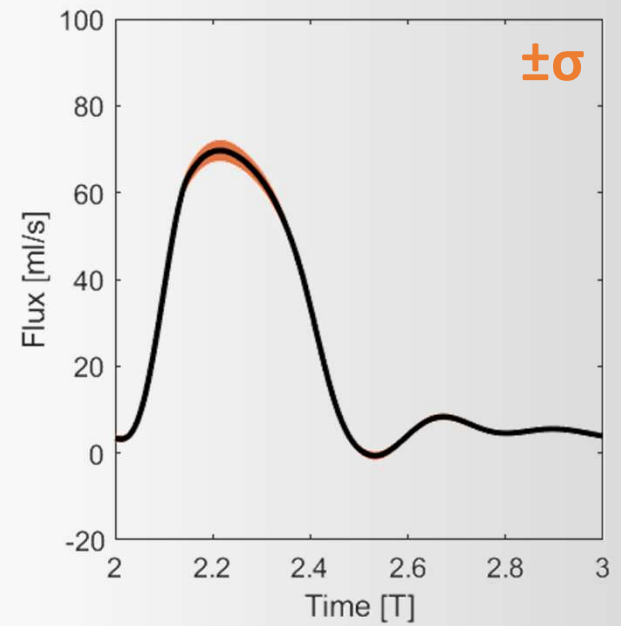
Pressure Drop



Outlet Flux 1



Outlet Flux 2



/ Future Works

- ▶ **Combined analysis of volume segmentation variability and MRI flux variability**
- ▶ **Effect of smoothing**
- ▶ **Comparison of segmentation methods: manual, semi-automatic, automatic**
- ▶ **FSI**

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